

# Simulator Development for Nanoelectronic and Electromagnetic Devices

Gerhard Klimeck\*, R. Chris Bowen, and Tom Cwik  
Jet Propulsion Laboratory, California Institute of Technology

\*Email: [gekco@jpl.nasa.gov](mailto:gekco@jpl.nasa.gov)

Phone: (818) 354 2182

Web: <http://www-hpc.jpl.nasa.gov/PEP/gekco>

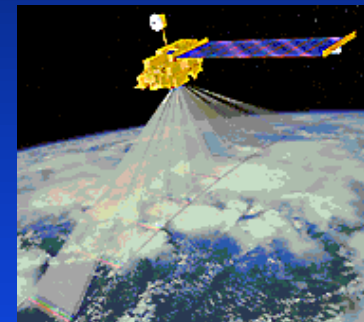


# High Performance Computing at JPL

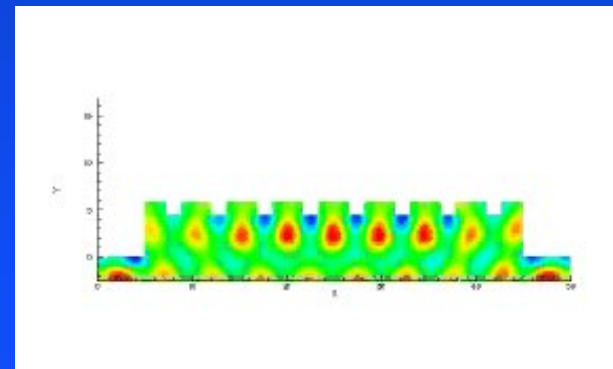
- JPL is the Lead Center for Robotic Space Exploration
  - Deep Space Missions
  - Earth Observing Missions
- JPL Builds Observational Systems for Remote Sensing
  - Imaging instruments across all wavelengths
  - Spectroscopic and in-situ instruments for planetary investigation
  - Fundamental technology development for new instruments
- JPL High Performance Computing is a Key Technology
  - Modeling and simulation of devices and instruments
  - Rapid data reduction and analysis
  - Advanced software design, implementation and application



<http://mars.jpl.nasa.gov>



<http://www-misr.jpl.nasa.gov>



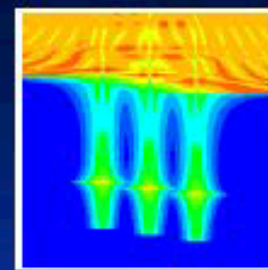
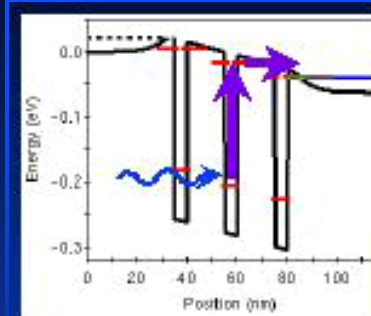
# High Performance Computing at JPL

## Current Work (Selected)

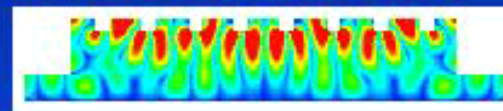
- Computational Modeling and Design

*Through the application of high performance computing, achieve physics-based, high-fidelity modeling of components needed for JPL missions*

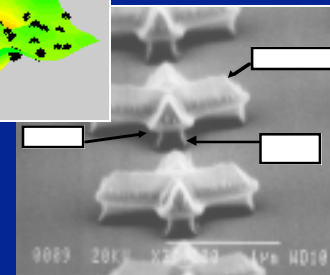
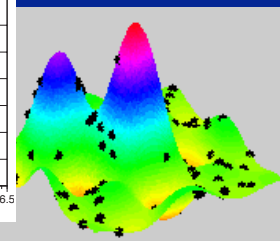
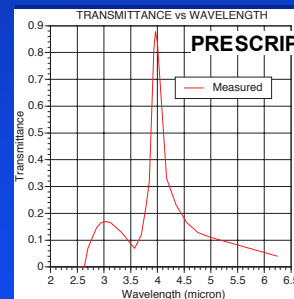
- Electronic Modeling of Nanoelectronic Devices
- Electromagnetic Modeling of Microelectronic Devices



Quantum Modeling



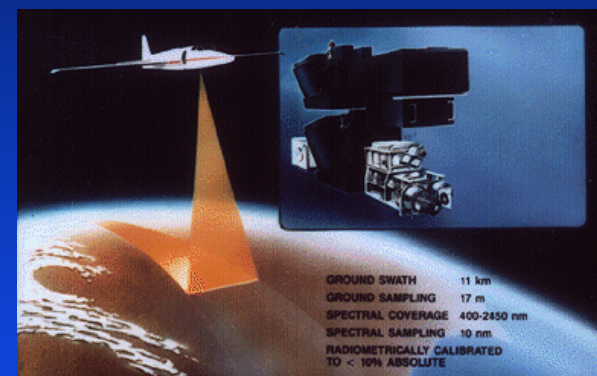
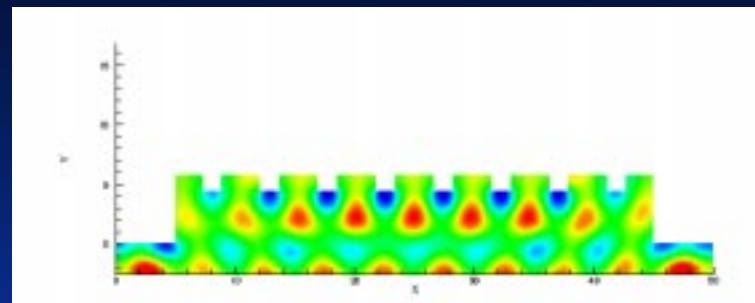
Electro-magnetic



# High Performance Computing at JPL

## Current Applications (selected)

- **Advanced Electromagnetic Design**
  - Designed grating structures to optimize light coupling into quantum well infrared photodetectors; performance enhanced a factor of 10 for imaging arrays.
- **Rapid Data Reduction and Analysis**
  - Software for atmospheric retrieval (removing effects of atmospheric scattering from measured data) moved to advanced parallel computers. Used in Airborne Visible InfraRed Imaging Spectrometer (AVIRIS) flight project.
- **Code Optimization and Parallelization**
  - We maintain expertise in application software development for large parallel computing platforms.

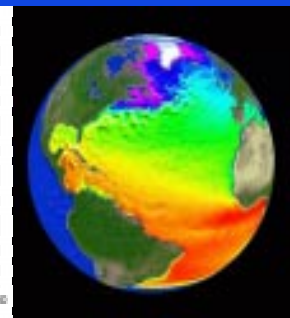
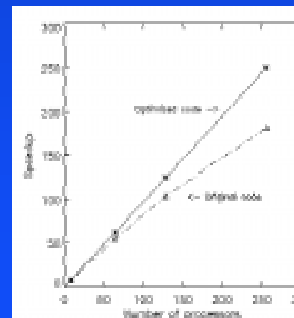
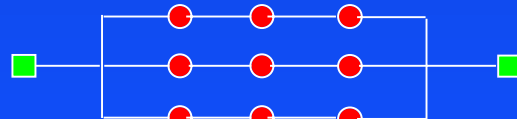


<http://makalu.jpl.nasa.gov/aviris.html>

**Serial code**



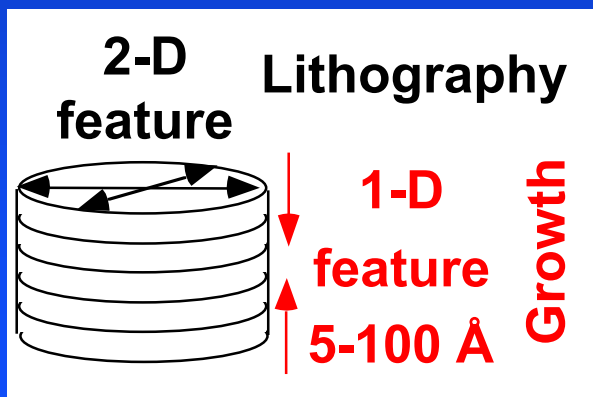
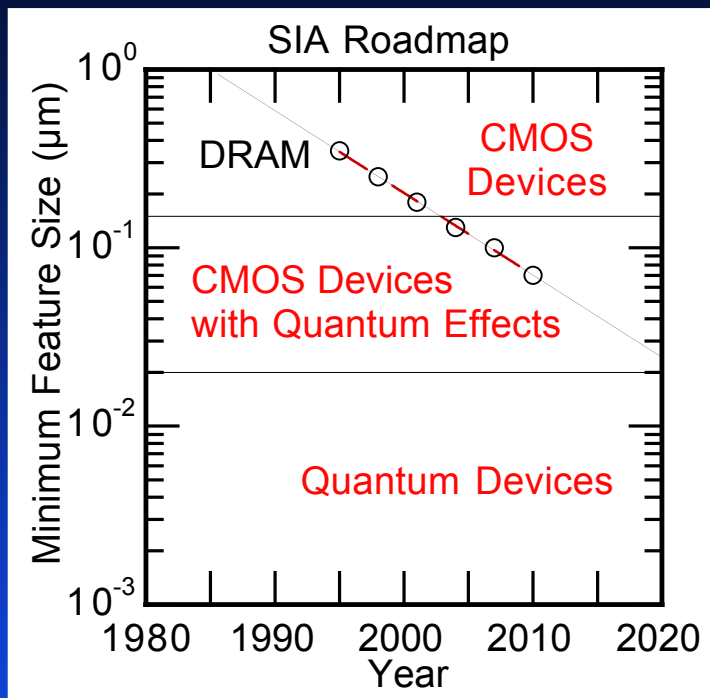
**Parallel code**



# Simulator Development for Nanoelectronic and Electromagnetic Devices

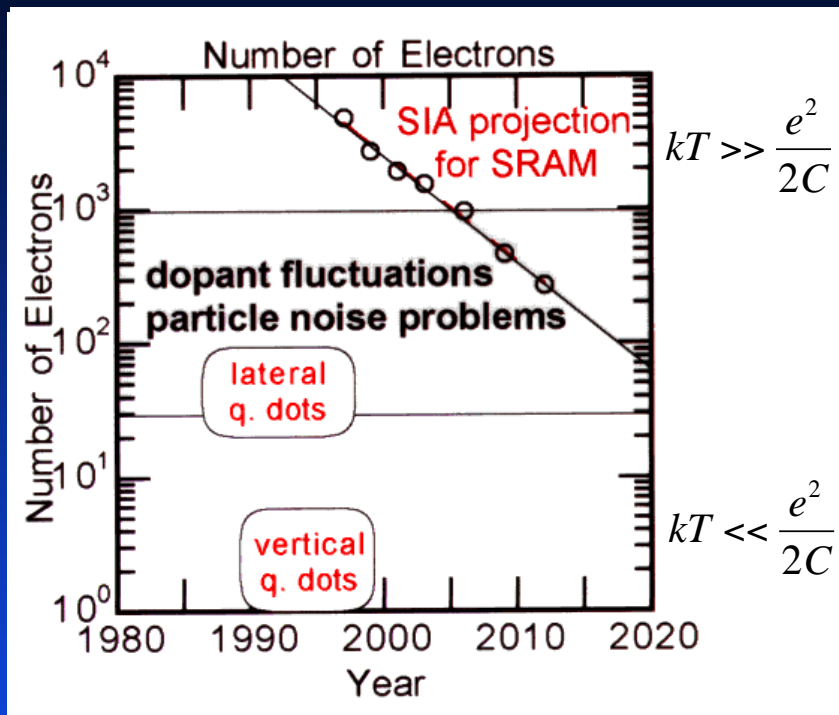
- **Motivation**
- **1D modeling**
  - Bandstructure
  - Resonant Tunneling
  - NEMO (NanoElectronic MOdeling)
- **3D modeling**
  - Quantum Dots
  - NEMO-3D
- **Design and Synthesis**
  - GENES (Genetically Engineered Nanostructured Devices)
- **Future Efforts**
- **Conclusions**

# Microdevices Head for Atomic Dimensions



- Moore's Law shows quantum devices in the far future.
  - Lithography data alone is deceiving: **Layer thicknesses are already on the atomic length scale!**
  - Commercial devices see quantum limitations:
    - direct tunneling
    - state quantization
  - Advanced devices utilize the quantum mechanical behavior:
    - Resonators (RTDs)
    - Active and passive sensors tunable by design - not by material system choice (QWIP).
- > 1D quantum device modeling
- > NEMO

# Microdevices Head for Single-Electronics



Reduction of Device Size

Reduction of electron #  
Reduction of Capacitance

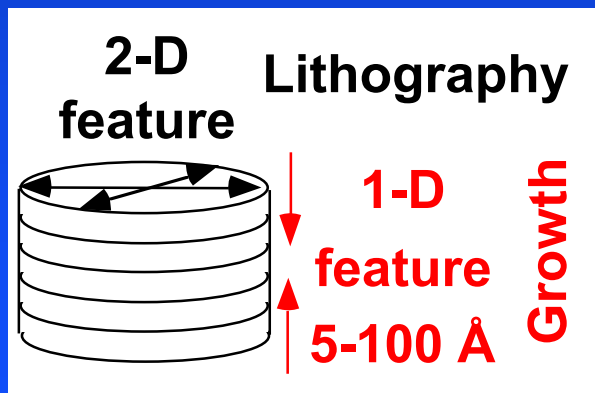
**Problem:**

Increase in thermal particle noise  
for tens and hundreds of particles

**Solution:**

Quantum Dots  
Artificial Atoms/Molecules  
**Single Electronics**

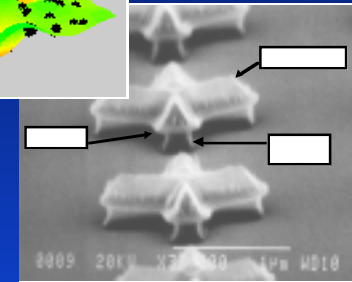
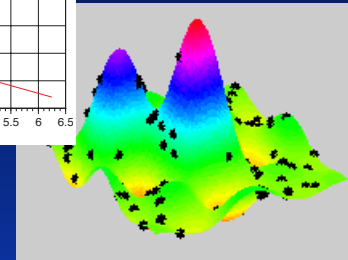
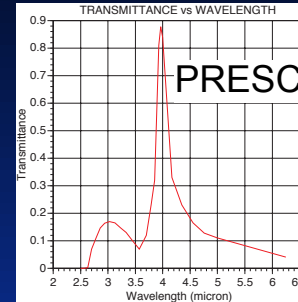
System is stable against  
thermal particle noise



# Global Optimization for Microelectronic Device Design

## Objective:

- Synthesis and optimization of microelectronic devices
- Limit and focus number of experiments needed to produce design



## Approach:

- Analysis with existing electromagnetic and electronic structure modeling codes
- Apply parallel genetic algorithm library for global optimization
- Use massively parallel platforms to complete designs

## Impact:

- Enable device optimization for microelectronic-based missions.
- Near Term:
  - Optimize devices.
- Long Term:
  - Provide instrument-system level optimization



# Simulator Development for Nanoelectronic and Electromagnetic Devices

- **Motivation**

- **1D modeling**

- Bandstructure
- Resonant Tunneling
- NEMO

- **3D modeling**

- Quantum Dots
- NEMO-3D

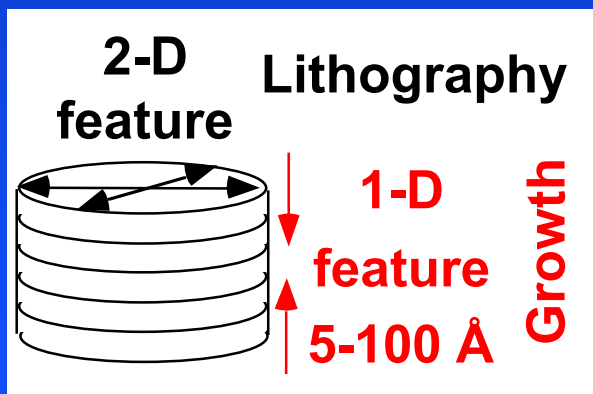
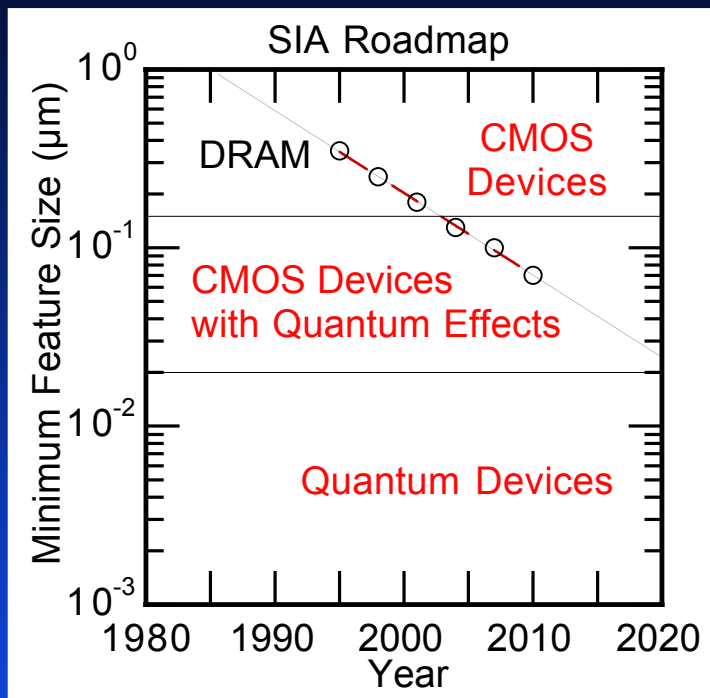
- **Design and Synthesis**

- GENES (Genetically Engineered Nanostructured Devices)

- **Future Efforts**

- **Conclusions**

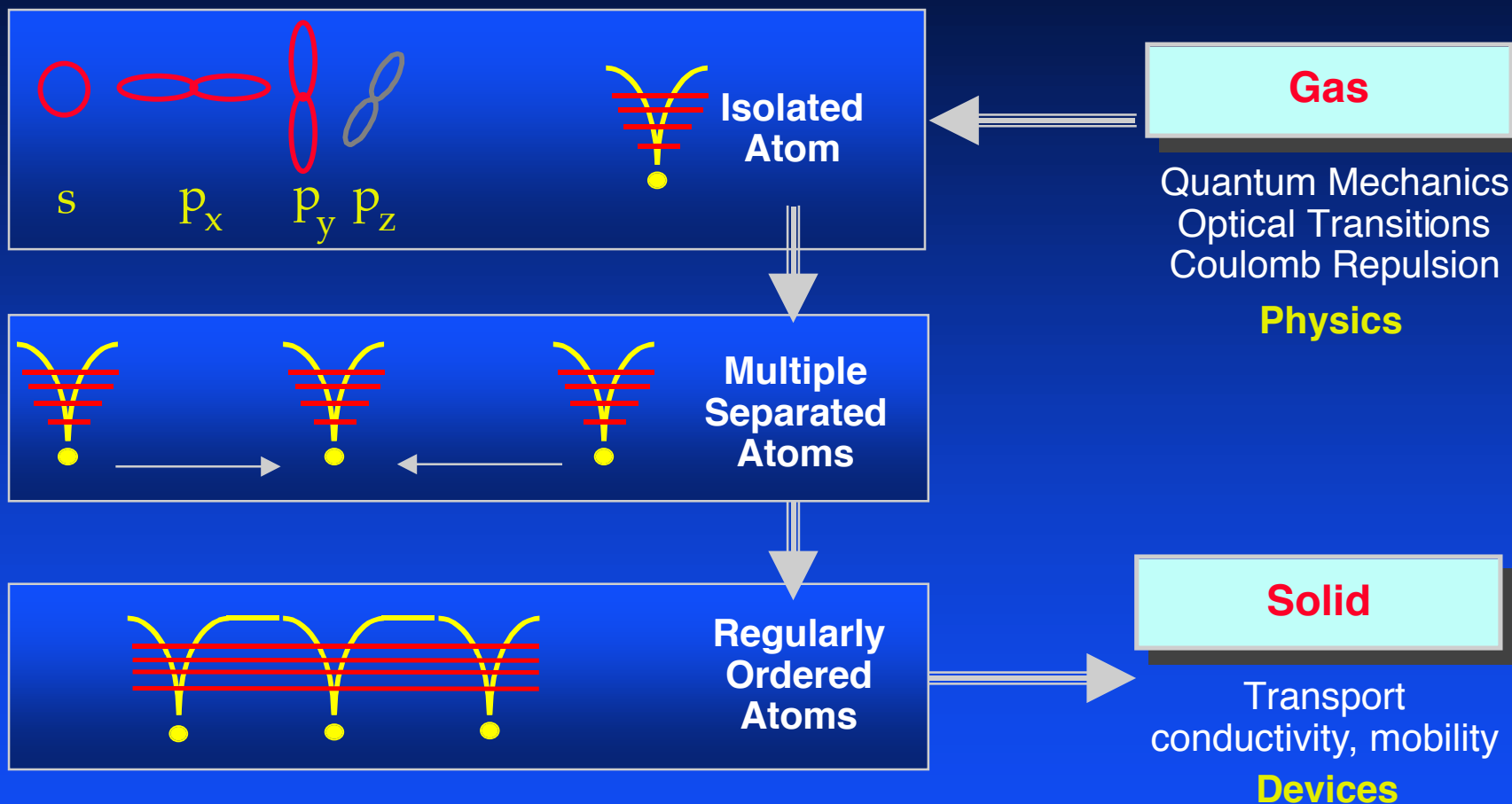
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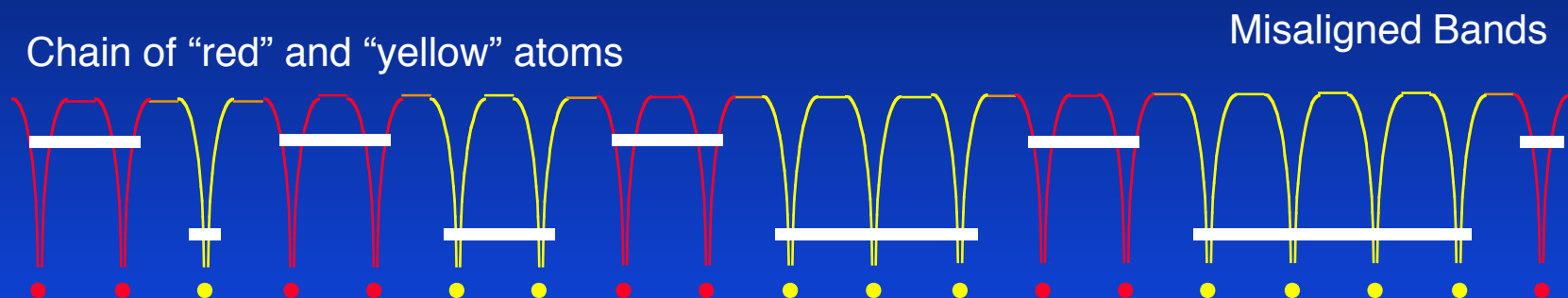
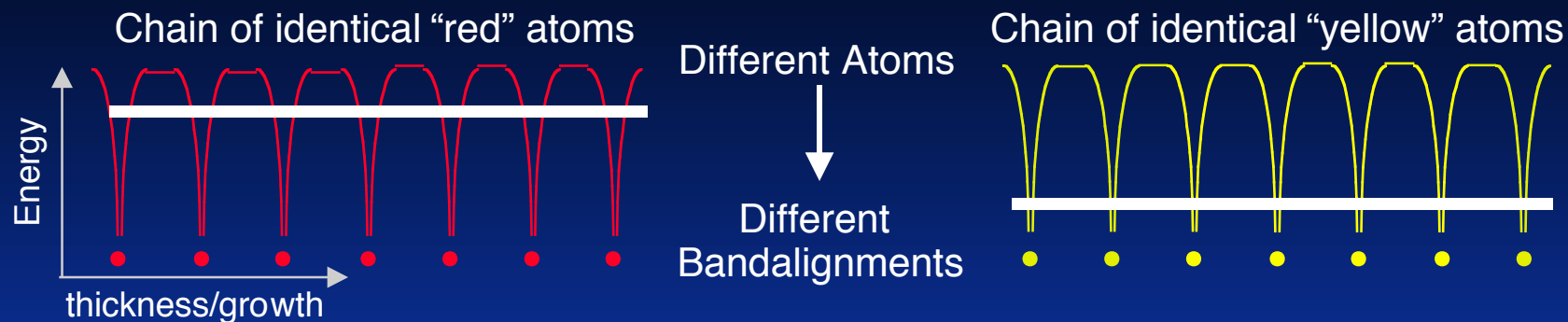
# Bandstructure Basics

## Electron Conduction in Solids

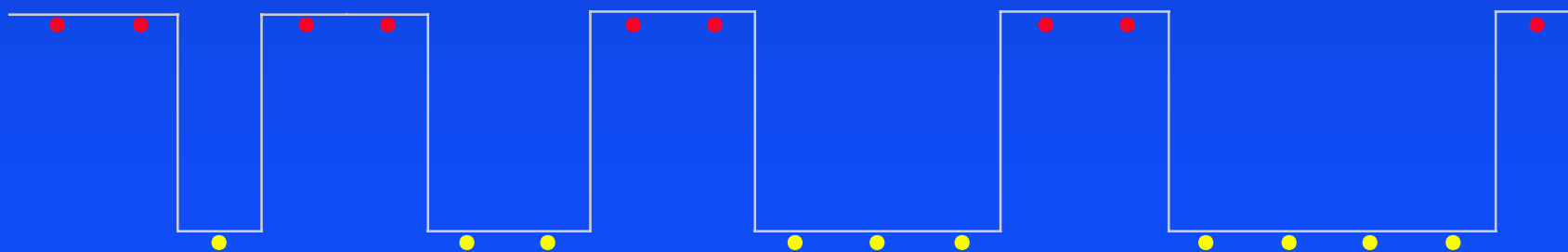


- Bands are channels in which electrons move “freely”.
- Layers of **different** atoms are deposited with **monolayer** control.
- We can **engineer** the electron **bands**.

# Bandstructure Engineering Basics

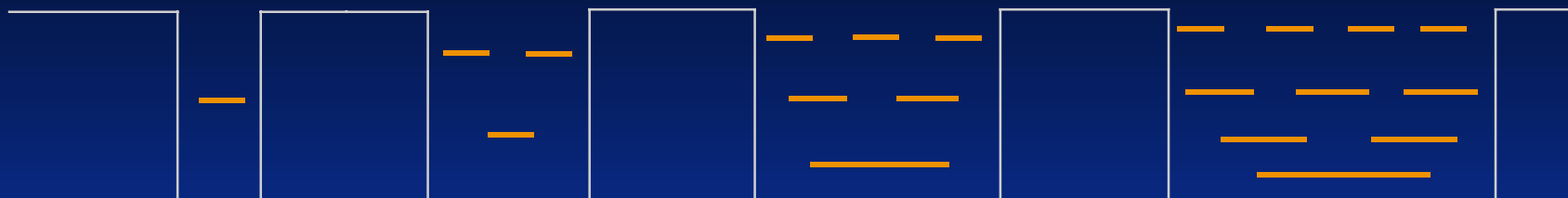


Layers with different band alignments

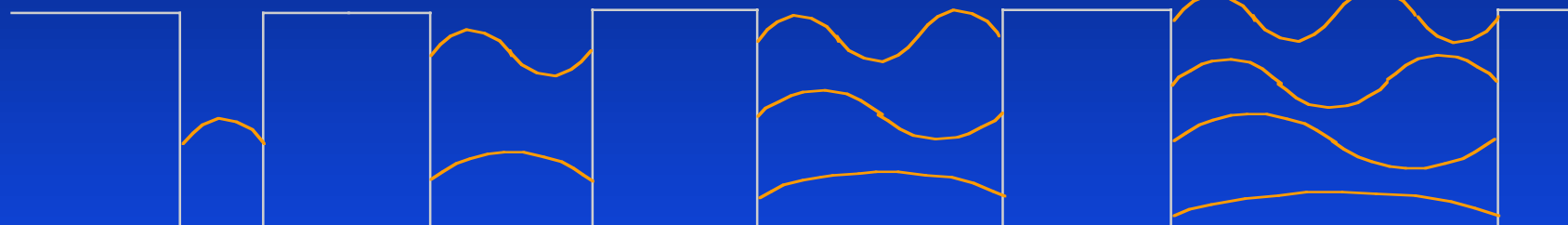


# Bandstructure Engineering Basics

Resonance Energies / Eigenvalues

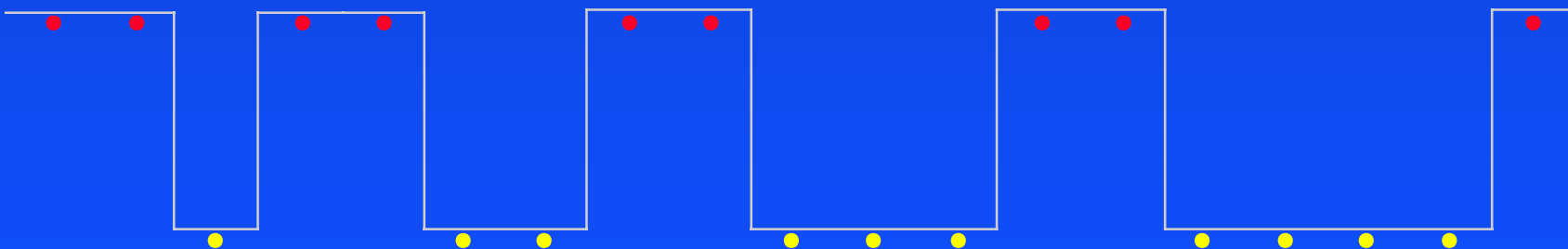


Barriers and Wells



Wave Functions / Eigenstates

Layers with different band alignments



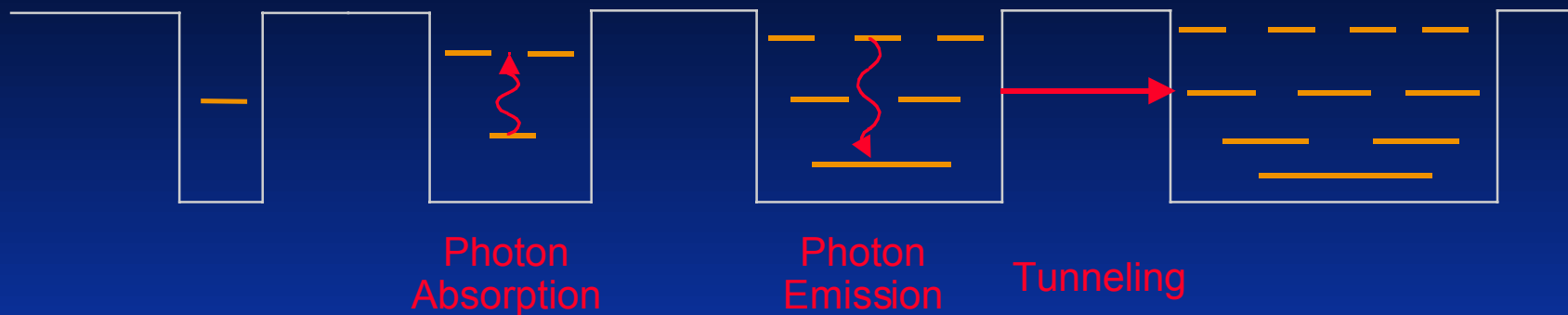
# Bandstructure Engineering Basics

Resonance Energies / Eigenvalues



# Bandstructure Engineering Applications

Transitions / Transport



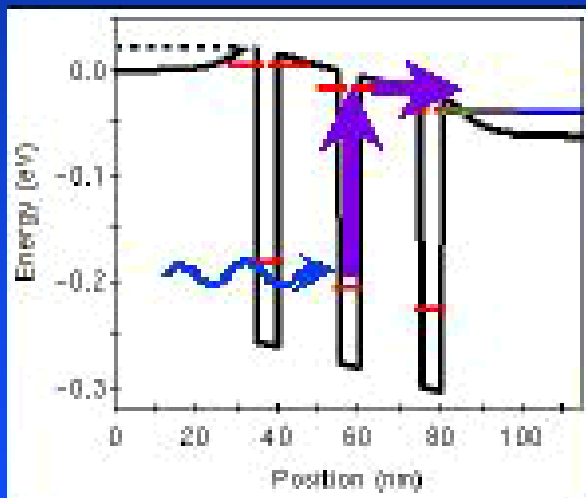
# Bandstructure Engineering Applications

Transitions / Transport



Photon  
Absorption

Detectors

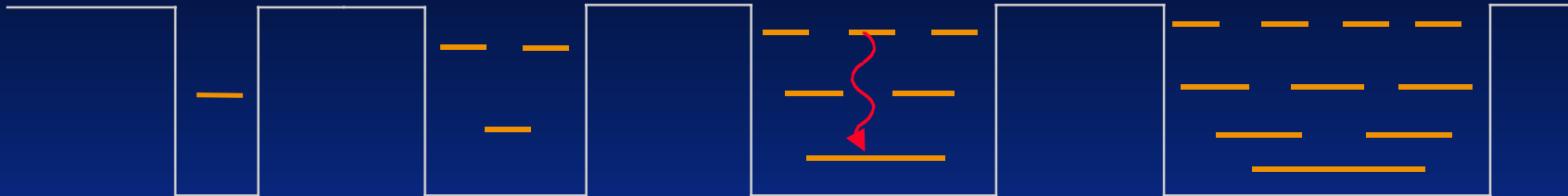


Quantum Well  
Infrared Detector



# Bandstructure Engineering Applications

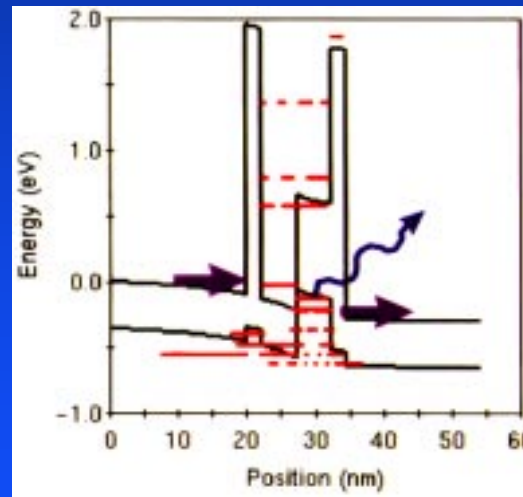
Transitions / Transport



Photon  
Emission



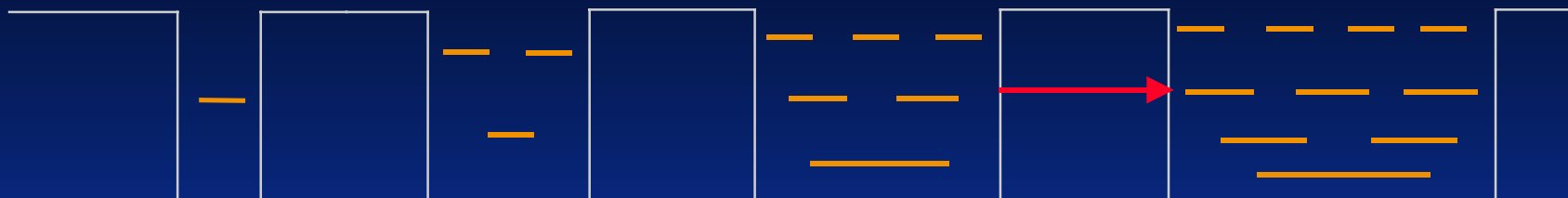
Lasers



Quantum Cascade  
Laser

# Bandstructure Engineering Applications

Transitions / Transport



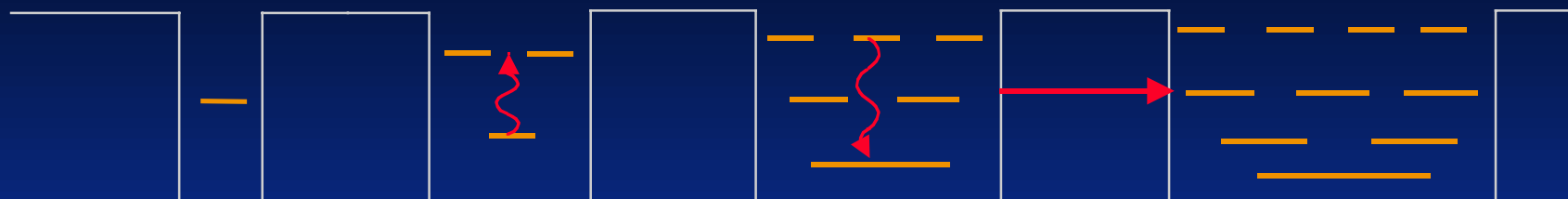
Tunneling

Logic / Memory



Resonant  
Tunneling  
Diode

# Transitions / Transport Controlled by Design



Photon  
Absorption

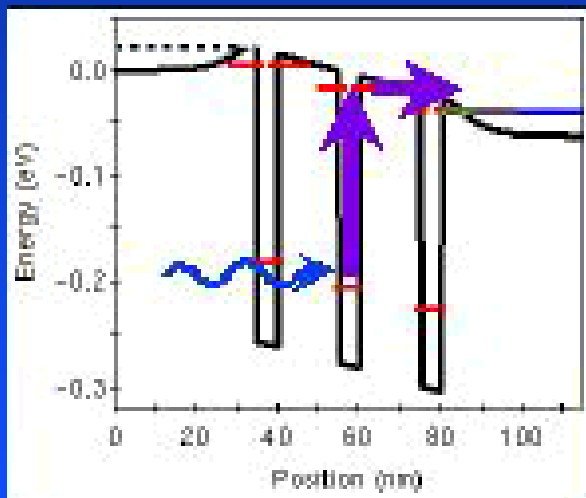
Photon  
Emission

Tunneling

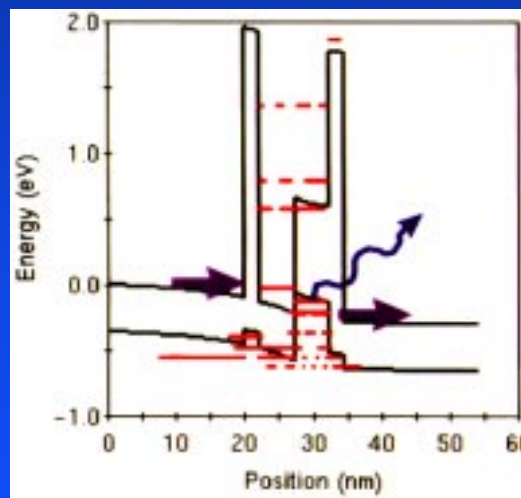
Detectors

Lasers

Logic / Memory



Quantum Well  
Infrared Detector

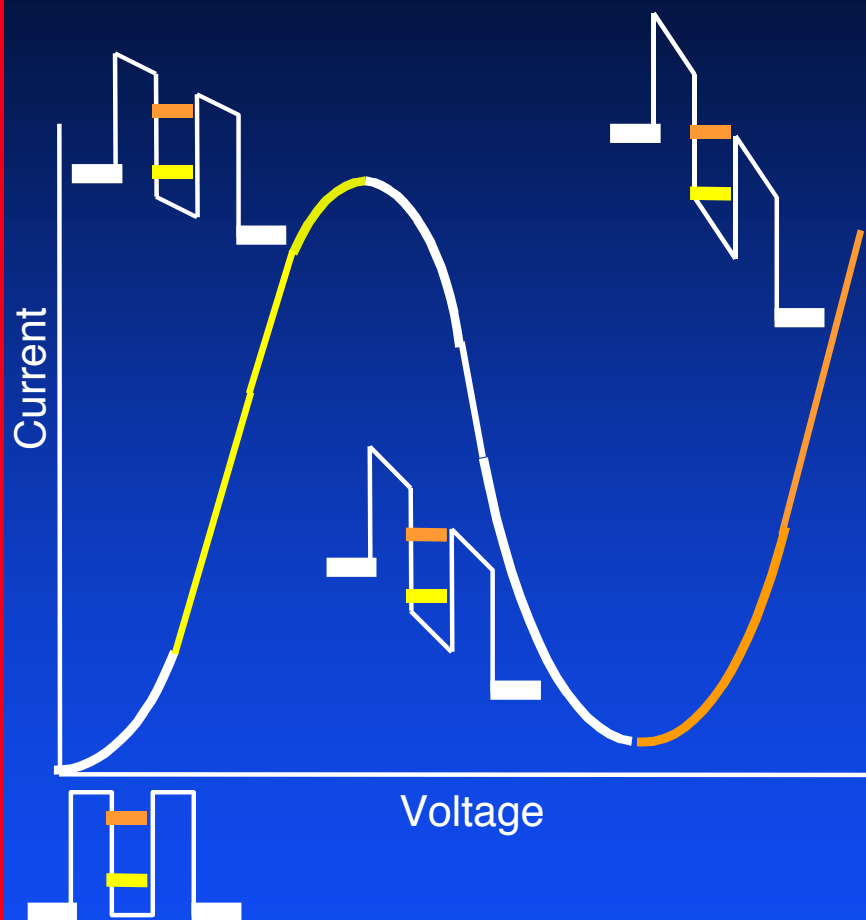


Quantum Cascade  
Laser

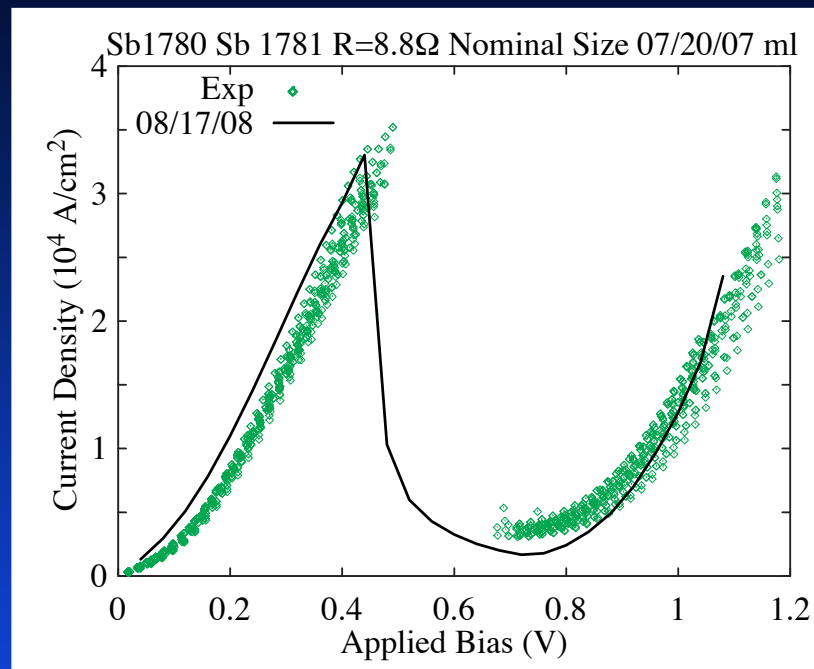


Resonant  
Tunneling  
Diode

# Resonant Tunneling Diode



Conduction band diagrams  
for different voltages  
and the resulting current flow.



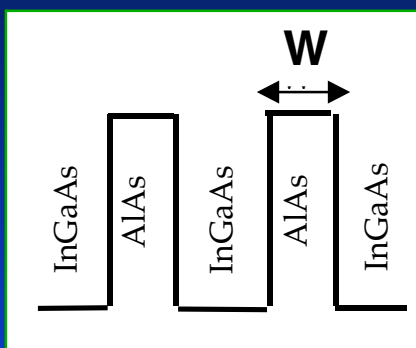
12 different I-V curves: 2 wafers, 3  
mesa sizes, 2 bias directions

50nm	1e18	InGaAs
7 ml	nid	InGaAs
7 ml	nid	AlAs
20 ml	nid	InGaAs
7 ml	nid	AlAs
7 ml	nid	InGaAs
50 nm	1e18	InGaAs

# NanoElectronic MOdeling (NEMO) Simulation

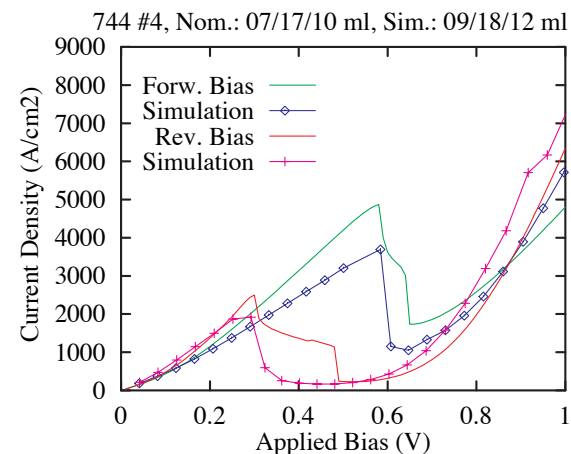
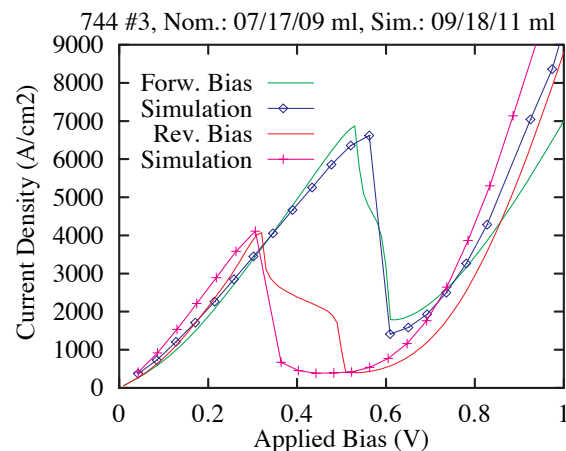
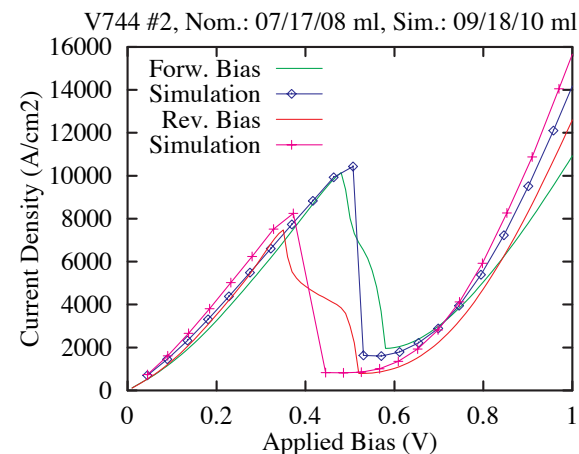
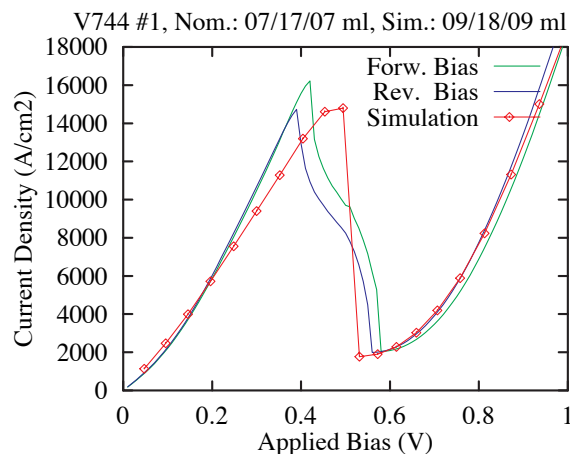
## Strained InGaAs/AlAs 4 Stack RTD with Asymmetric Barrier Variation

**Vary One Barrier Thickness**



**Four increasingly asymmetric devices:**

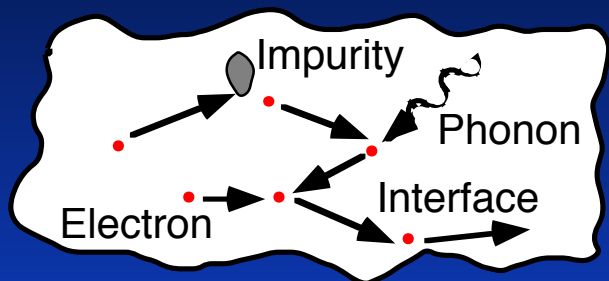
20/50/20 Angstrom  
20/50/23 Angstrom  
20/50/25 Angstrom  
20/50/27 Angstrom



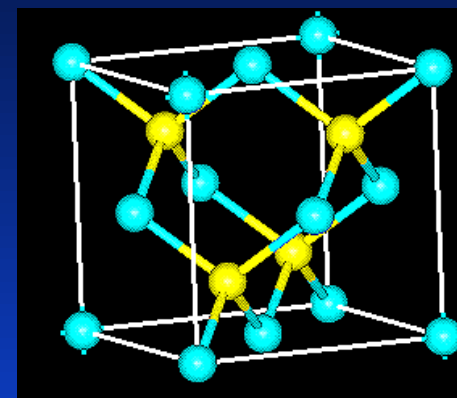
Presented at IEEE DRC 1997, work performed at Texas Instrument, Dallas

# Where is NEMO compared to other models?

What is Needed for Quantum Electron Transport?



**NEMO**  
Charging  
Bandstructure  
Scattering  
Interference



Drift-Diffusion  
Boltzmann Eq.

Non-Equilibrium  
Green Functions

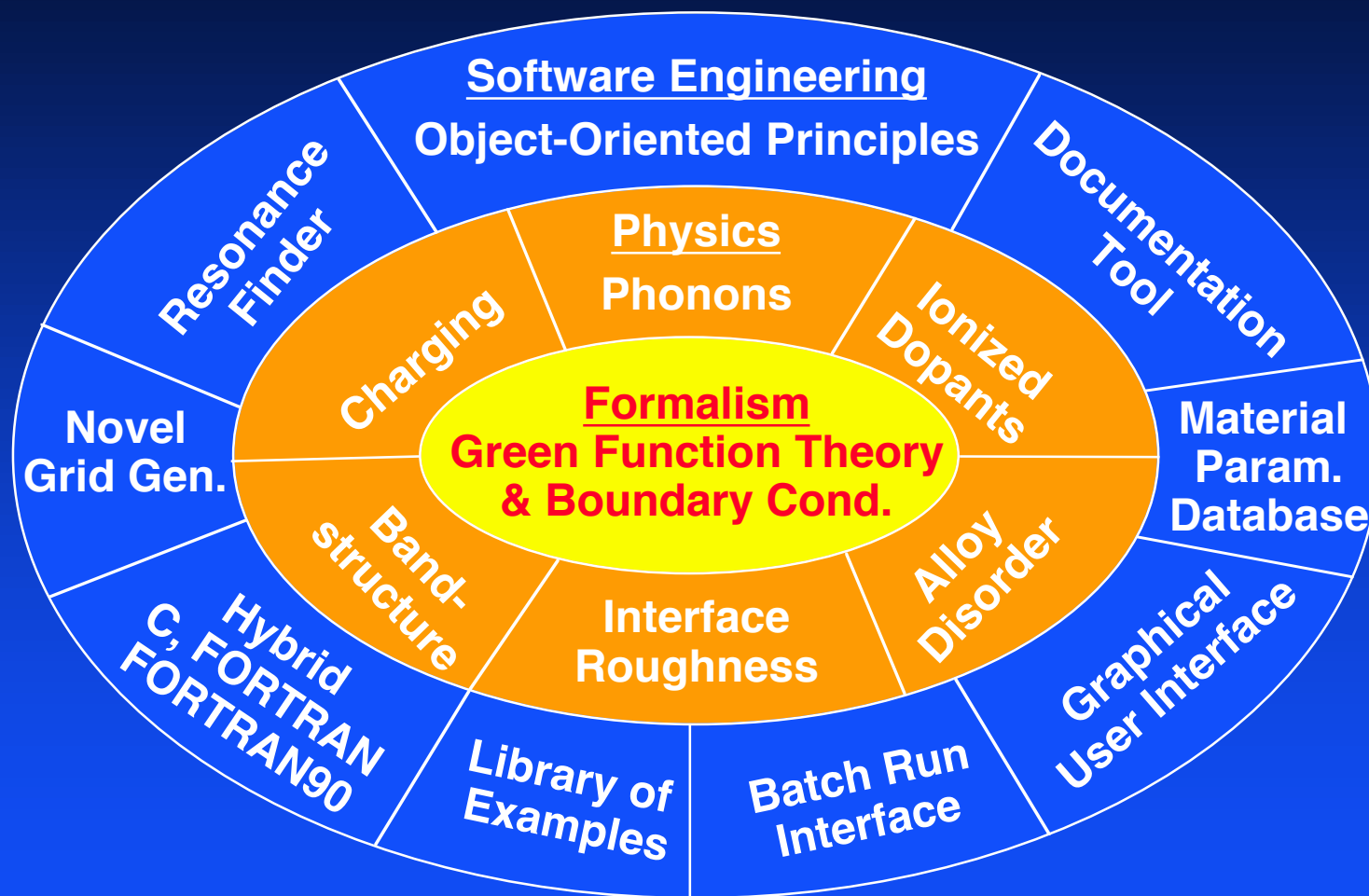
Schrödinger  
Equation

Transport with particle interaction

Quantum Mechanics

# NEMO: A User-friendly Quantum Device Design Tool

Formalism, Physics, and Technology



Approximately 250,000 lines of code

## NEMO Genealogy

- NEMO was developed under a government contract to Texas Instruments and Raytheon from 1993-1997
  - Theory
    - Roger Lake, **Chris Bowen**, **Gerhard Klimeck**, Tim Boykin (UAH)
  - Graphical User Interface
    - Dan Blanks, **Gerhard Klimeck**
  - Programming Approach, Philosophy, and Prototypes
    - Bill Frensley (UTD), **Gerhard Klimeck**, **Chris Bowen**
  - Coding Help
    - Manhua Leng (UTD), Chenjing Fernando, Paul Sotirelis, Dejan Jovanovic, Mukund Swaminathan (UTA),
  - Experiments for verification
    - Ted Moise, Alan Seabaugh, Tom Broekaert, Berinder Brar, Yung-Chung Kao
- **Gerhard Klimeck and Chris Bowen were the core developers. They are both with JPL now.**

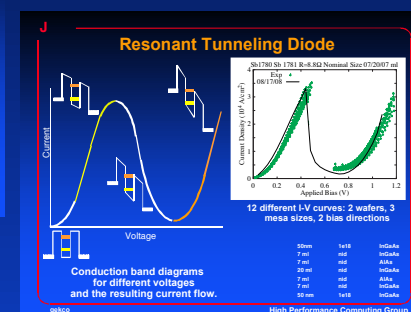
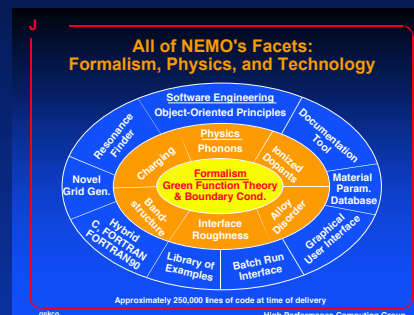


# Simulator Development for Nanoelectronic and Electromagnetic Devices

## • Motivation

## • 1D modeling

- Bandstructure
- Resonant Tunneling
- NEMO



## • 3D modeling

- Quantum Dots
- NEMO-3D

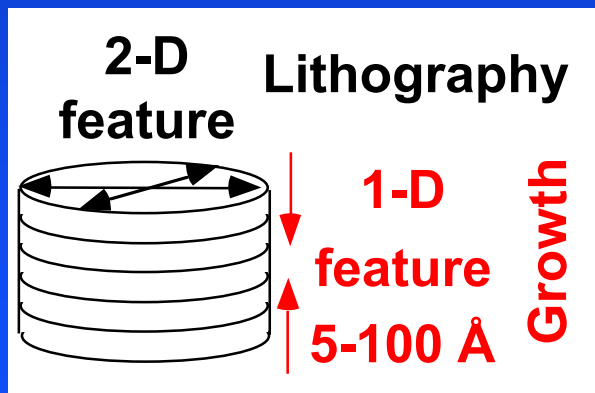
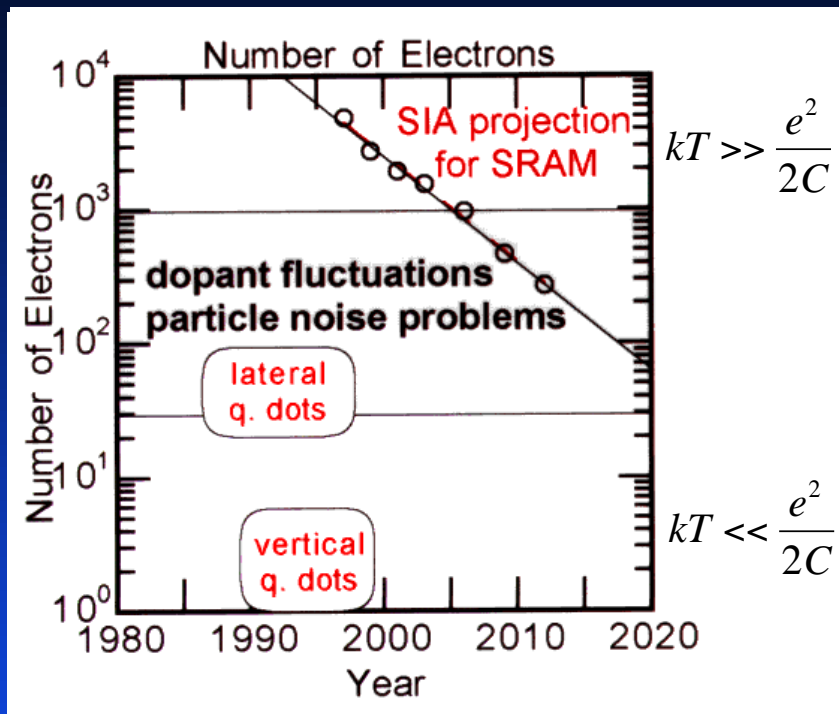
## • Design and Synthesis

- GENES (Genetically Engineered Nanostructured Devices)

## • Future Efforts

## • Conclusions

# Microdevices Head for Single-Electronics



Reduction of Device Size

Reduction of electron #  
Reduction of Capacitance

**Problem:**

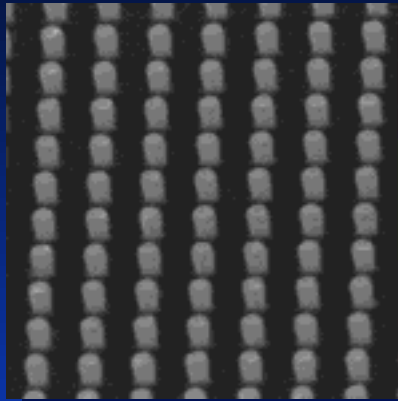
Increase in thermal particle noise  
for tens and hundreds of particles

**Solution:**

Quantum Dots  
Artificial Atoms/Molecules  
**Single Electronics**

System is stable against  
thermal particle noise

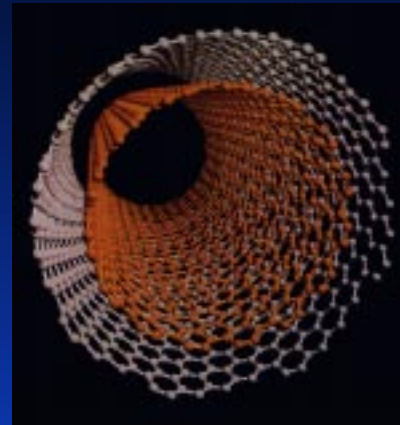
## Examples of 3D Confined Structures



### Quantum Dots:

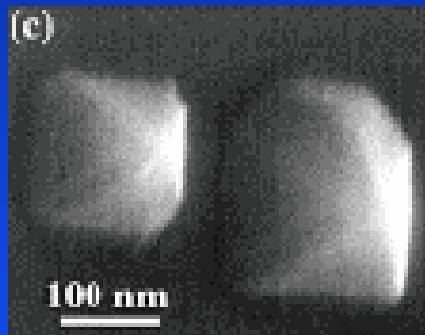
Litho-based,  
GaAs/AlGaAs,  
InGaAs/InAlAs  
systems

Cylinder shaped  
M Reed et al, TI  
(1988)



**Fullerenes, C60:**  
Carbon based  
Electronic and  
mechanical appl.

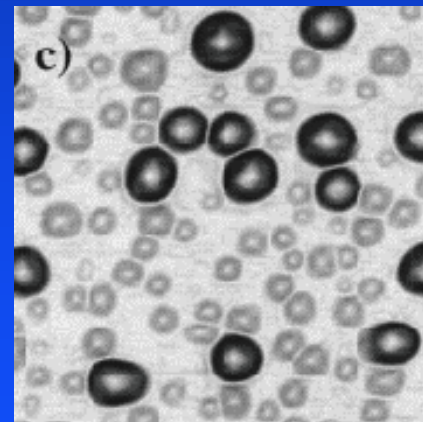
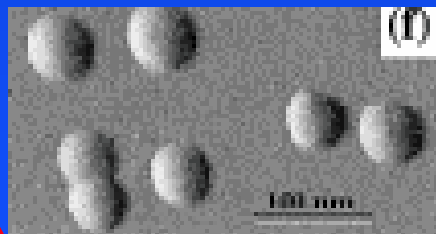
Rice Univ.,  
NASA Ames



**Quantum Dots:**  
Self-assembled,  
InAs on GaAs.

Pyramidal or  
dome  
shaped

R. Leon et al,  
JPL (1998)



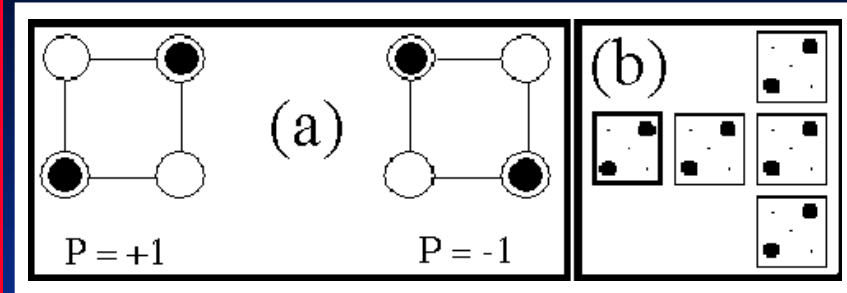
**Quantum Dots:**  
Self-assembled,  
Ge on Si.

Dome  
shaped

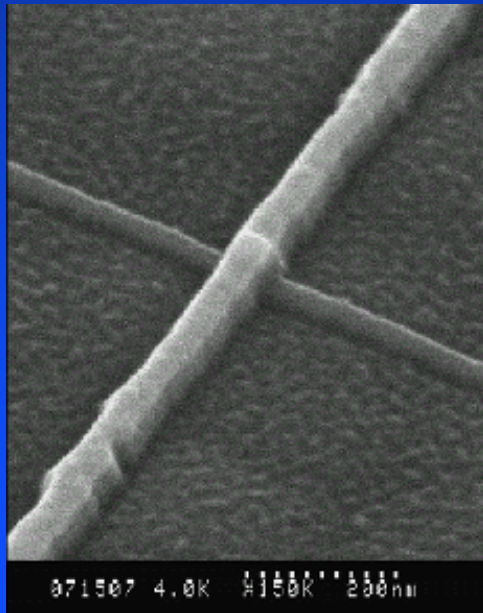
S. Williams et al,  
HP (1998)

# Quantum Dots Applications

- **Memory:**  
Store discrete charge in potential wells.
- **Transistors:**  
Use discreteness of channel conduction.
- **Logic:**  
Use electrostatically coupled quantum dots.

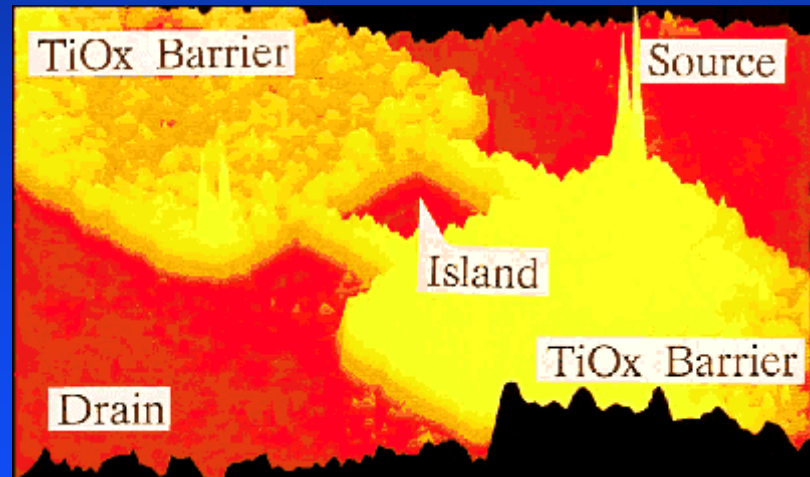


Lent, Porod @ Notre Dame: Quantum Cellular automata, electrostatically coupled quantum dots.



Chou @ Princeton  
Room Temp.  
Single Electron  
Memory

Hitachi:  
128Mbit  
Integration  
demonstrated

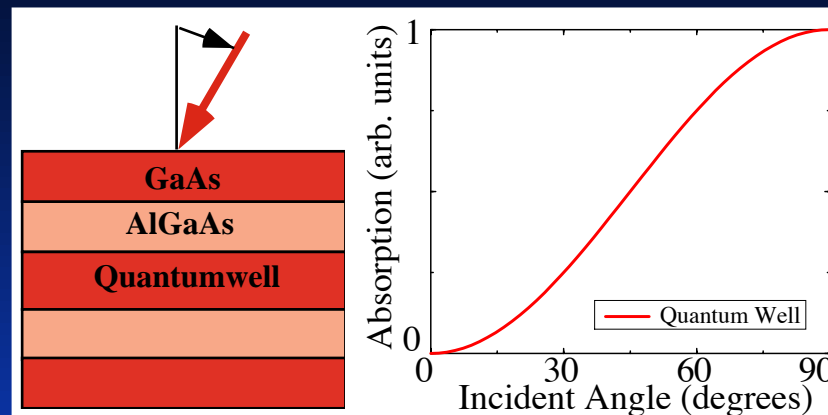


Harris @ Stanford: Room temperature single electron transistor

# Quantum Dots as Optical Detectors

## Desensitizing QWIP to Polarization

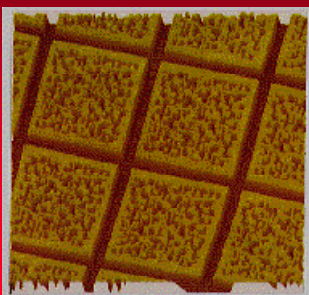
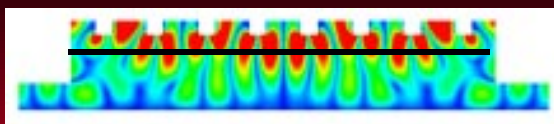
- **Problem:**  
Quantum wells are “blind” to light impinging orthogonal to the detector surface.
- **Standard Solution:**  
Use gratings to turn polarization
- **New Approach:**  
Quantum dots have a built-in anisotropy and state quantization in all three dimensions  
-> absorption at all angles



**Quantum Wells: Absorption has strong incidence angle dependence**

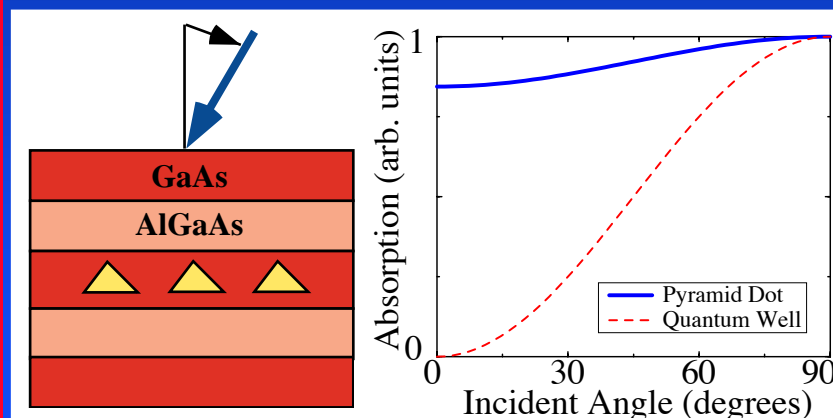
**Standard Solution:**  
**Grating**

### Electromagnetic Modeling



electric field models

↓  
optimized light coupling



**Quantum Dots: Absorption has **weak** incidence angle dependence**



# Development of a 3D Quantum Simulator

## Problem:

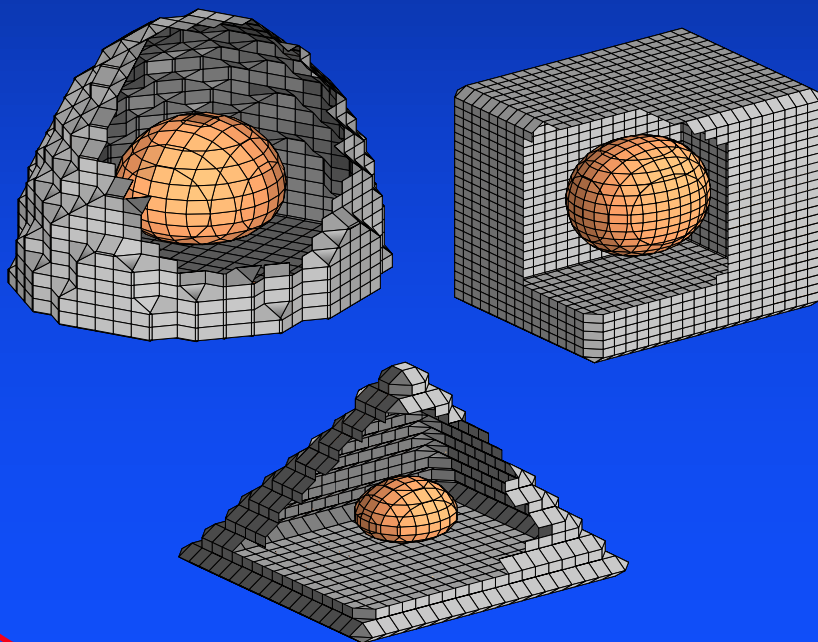
- Develop quantum dot based technologies for digital and optoelectronic applications.

## Approach:

- Deliver a graphically driven quantum dot design tool.
- Leverage JPL's strength in massively parallel computation.

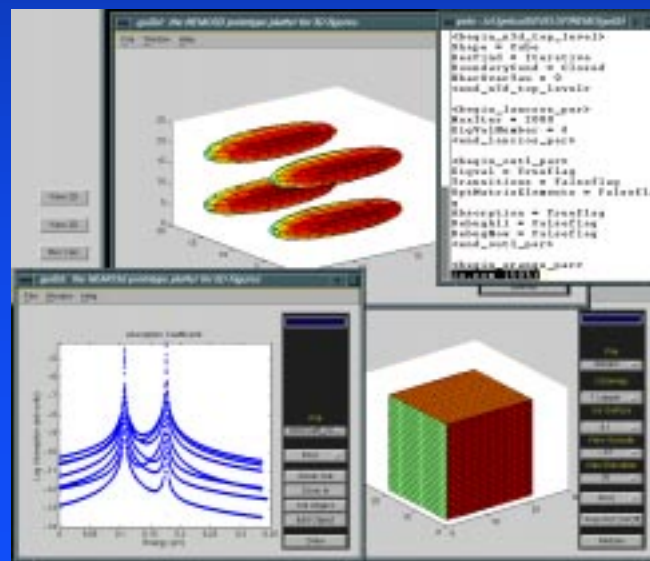
## Impact:

- Near Term - Optical Detection:
  - Guidance for choice of sizes, materials, shapes.
  - Optimize optical absorption.
- Long Term:
  - Provide general modeling tools for the analysis of ultra-scaled structures.



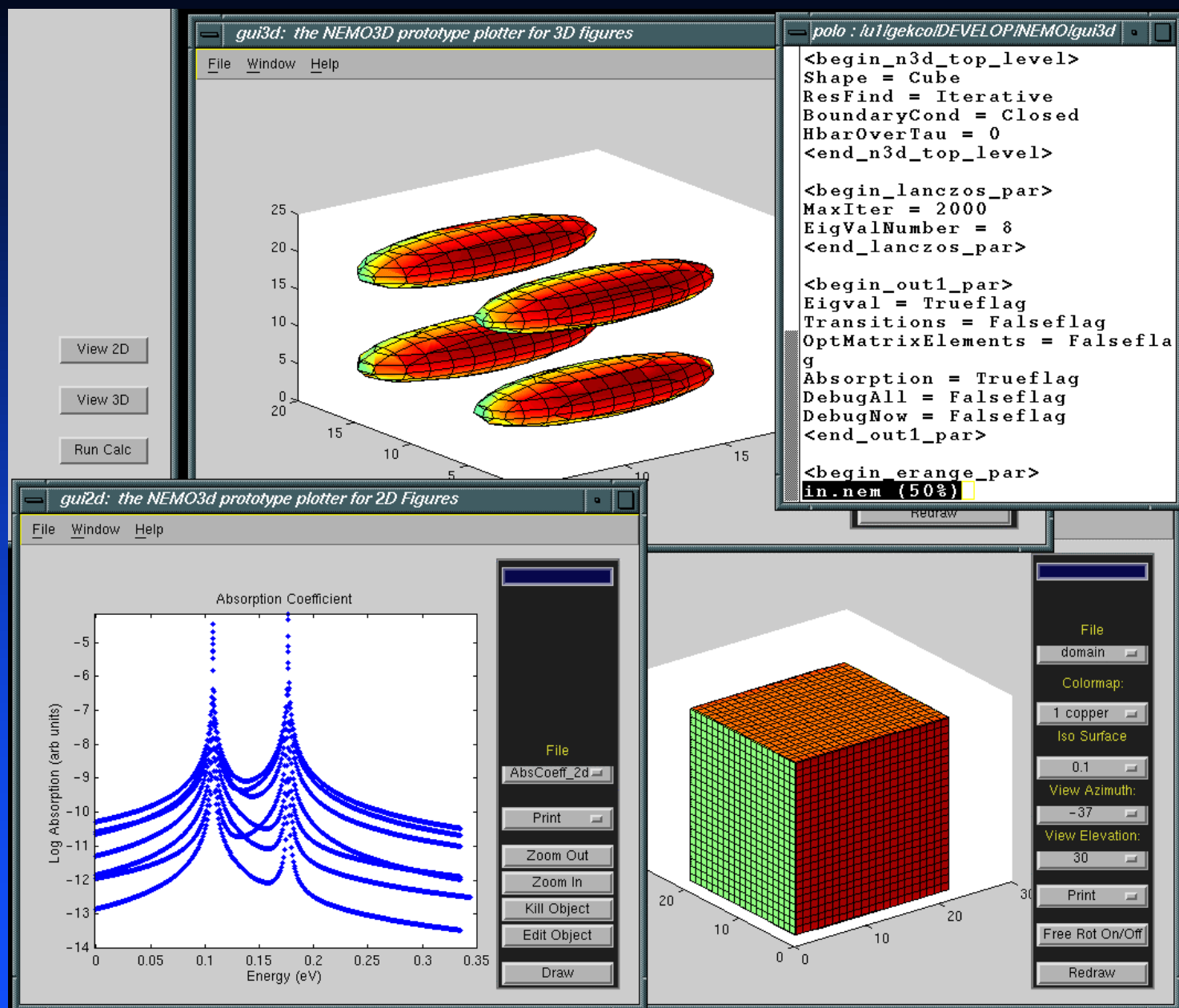
gekco

## We are toolmakers!



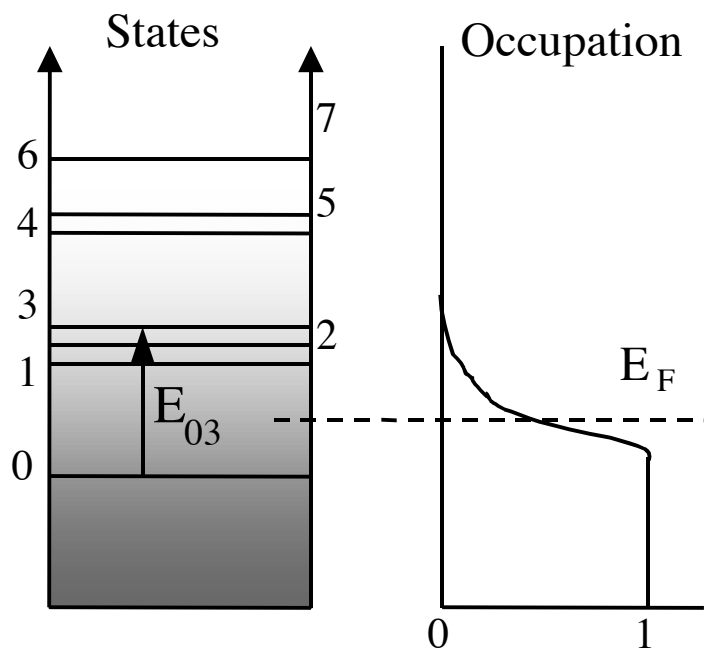
High Performance Computing Group

## We Are Toolmakers!

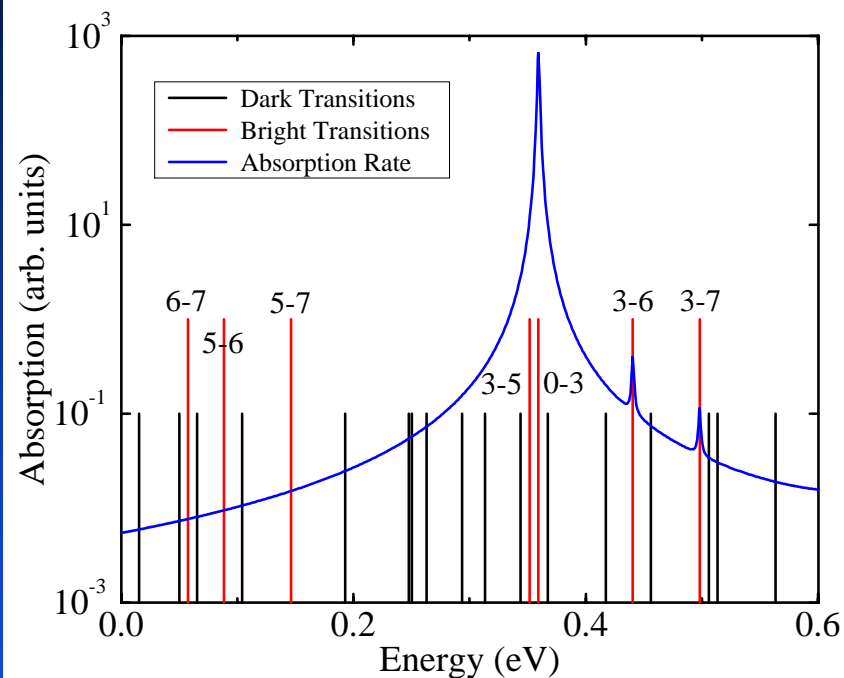


# Optical Absorption in a Pyramidal Dot

## State Occupation



## Absorption vs Energy



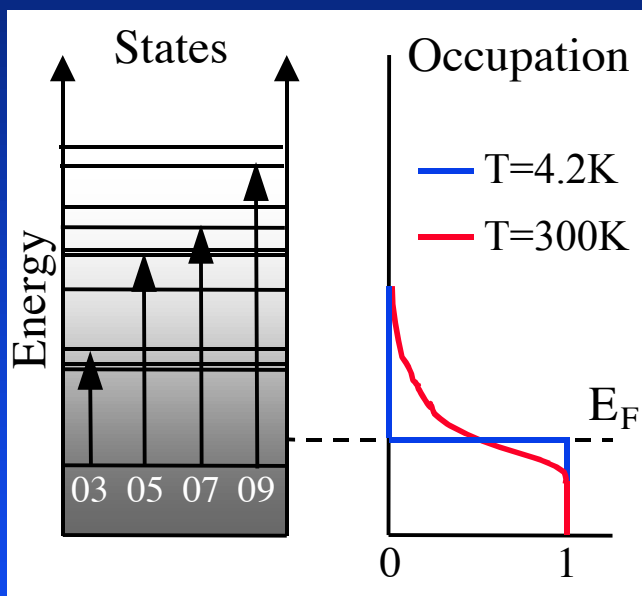
**Two Issues influence the absorption strongly:**

- Only the lowest 4 states contain electrons, so transitions between higher states do not result in optical absorption.
- Bright transitions occur between states that possess opposite parity in the direction of the optical field.

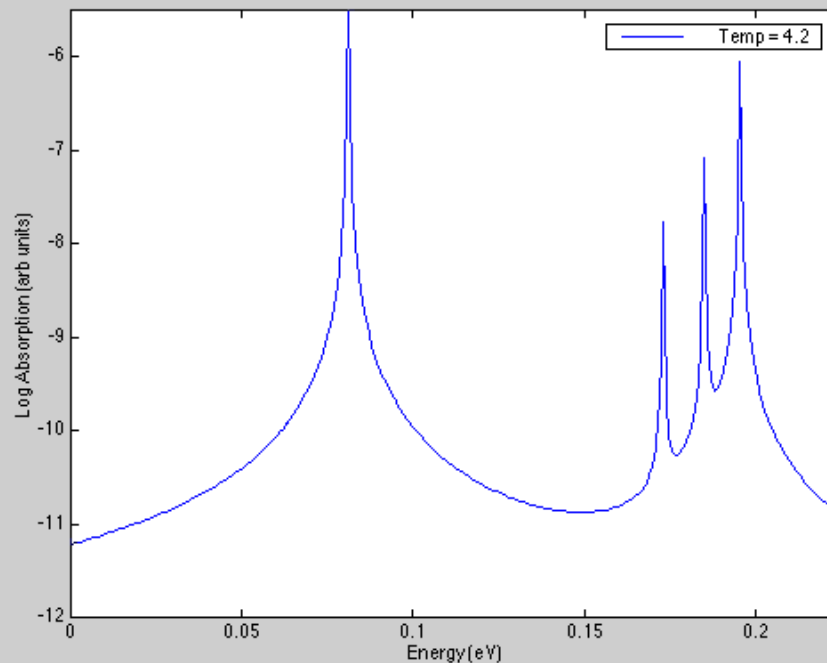


# Temperature Dependence of Quantum Dot Absorption Spectrum

## State Occupation



## Absorption



**Higher temperatures  $\Rightarrow$  More occupied states  $\Rightarrow$  More transitions.**

# Summary - After 2 Months of Work

## Achievements:

- Prototyped general eigenvalue solver which scales as order  $N^{1.1}$  rather than  $N^3$ .
- Solved  $N=10^6$  grid point problem on 1 CPU in 1 hour.
- Developed graphical interface prototype.

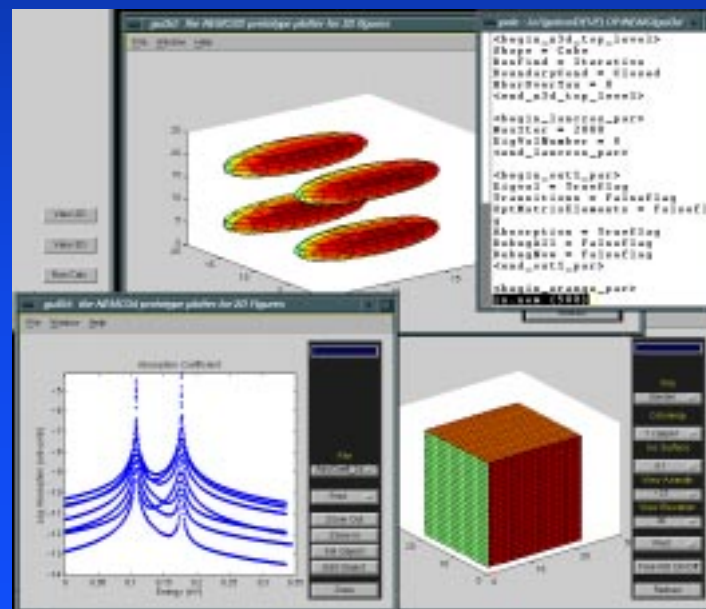
## Future Resource Requirements:

- Bandstructure models cause 400x increase in required CPU time.  
-> computation is CPU not memory limited  
-> need massively parallel machines with good wall-clock turn-around
- Engineering optimization/evolution will require thousands of runs  
-> need next generation supercomputer

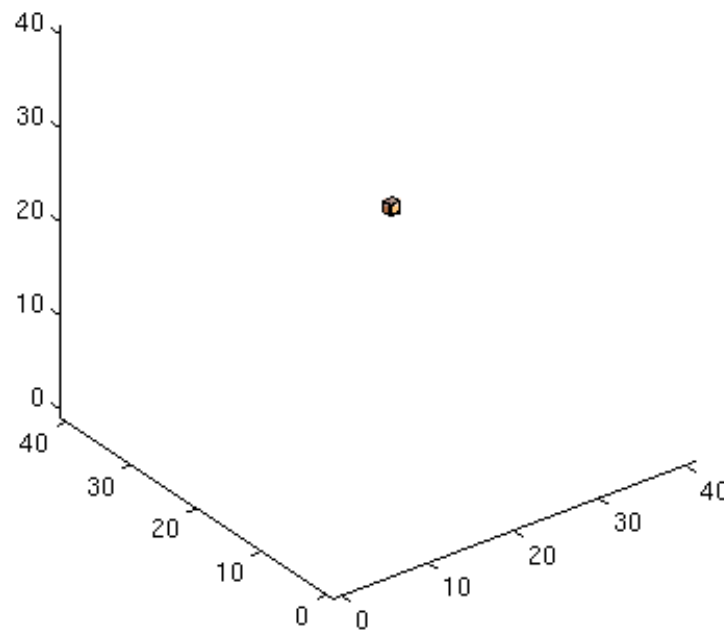
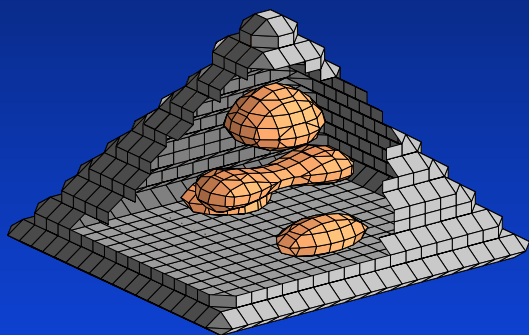
## Plans:

- Incorporate mechanical strain.
- Incorporate sp3s\* and sp3d5 bandstructure models.
- Electron charging effects.
- Prototype parallel version of eigenvalue solver.
- Prototype client-server approach to interface graphical user interface to supercomputers.

**We are toolbuilders**



# Animation of the 7th Eigenstate in a Pyramidal Quantum Dot



# Simulator Development for Nanoelectronic and Electromagnetic Devices

## • Motivation

## • 1D modeling

- Bandstructure
- Resonant Tunneling
- NEMO

## • 3D modeling

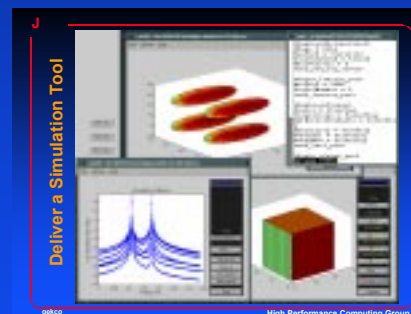
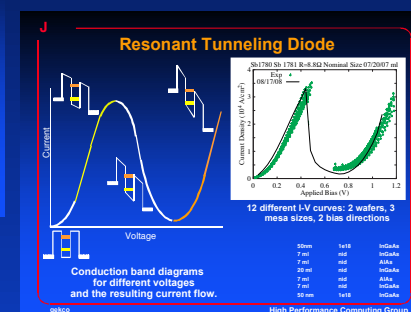
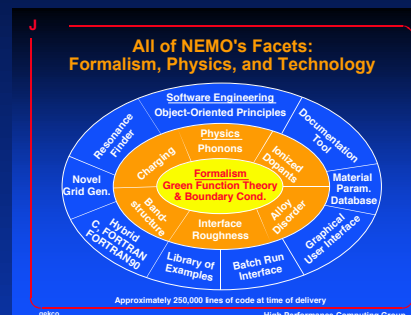
- Quantum Dots
- NEMO-3D

## • Design and Synthesis

- GENES (Genetically Engineered Nanostructured Devices)

## • Future Efforts

## • Conclusions



# Global Optimization for Microelectronic Device Design

## Genetically Engineered NanoElectronic Structures: GENES

### Objective:

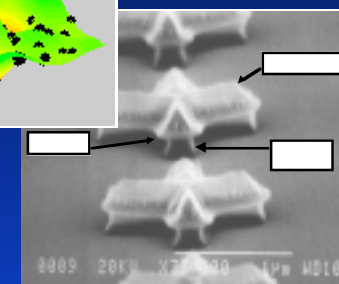
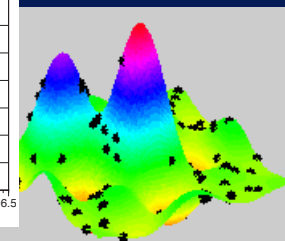
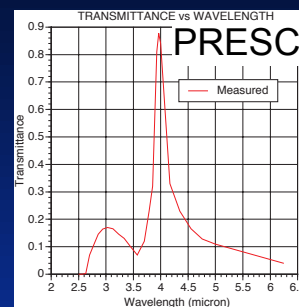
- Optimize and synthesize electronic devices
- Limit and focus number of experiments needed to produce design.

### Approach:

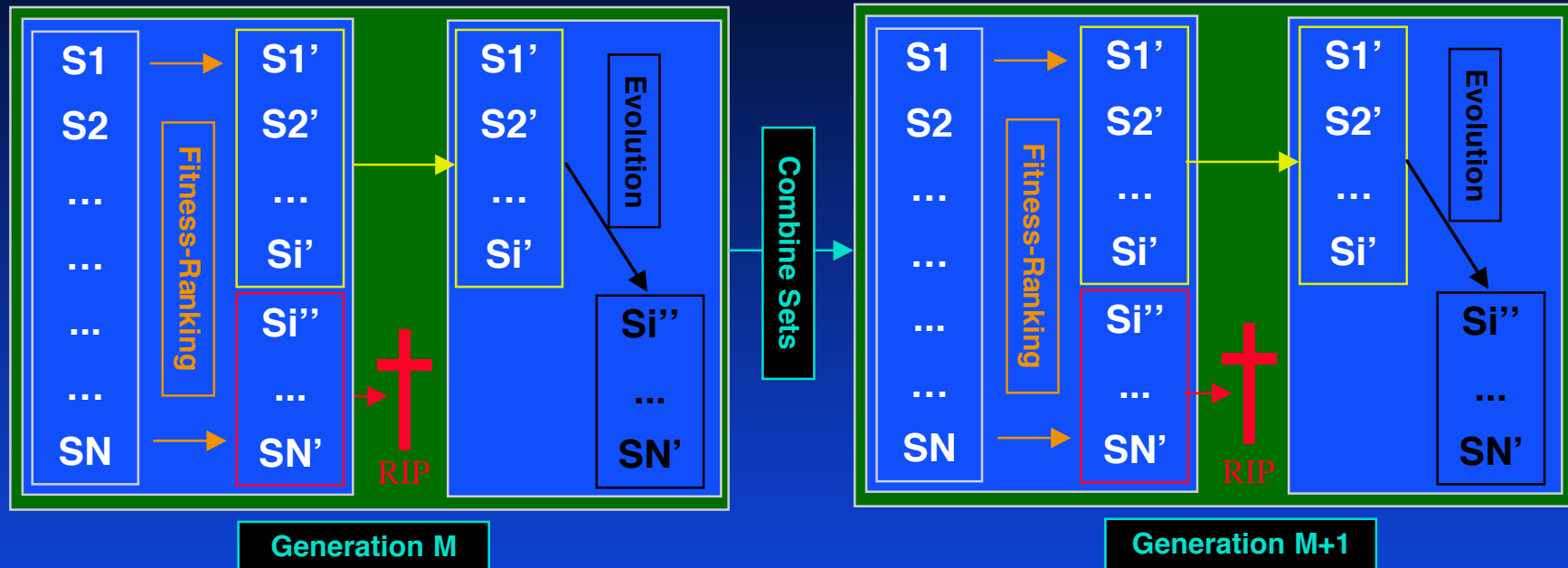
- Use existing electromagnetic and electronic structure modeling codes
- Apply genetic algorithm for global optimization
- Use massively parallel platforms

### Impact:

- Enable device optimization for microelectronic-based missions.
- Near Term:
  - Optimize devices.
- Long Term:
  - Provide instrument-system level optimization



# Basic Genetic Algorithm

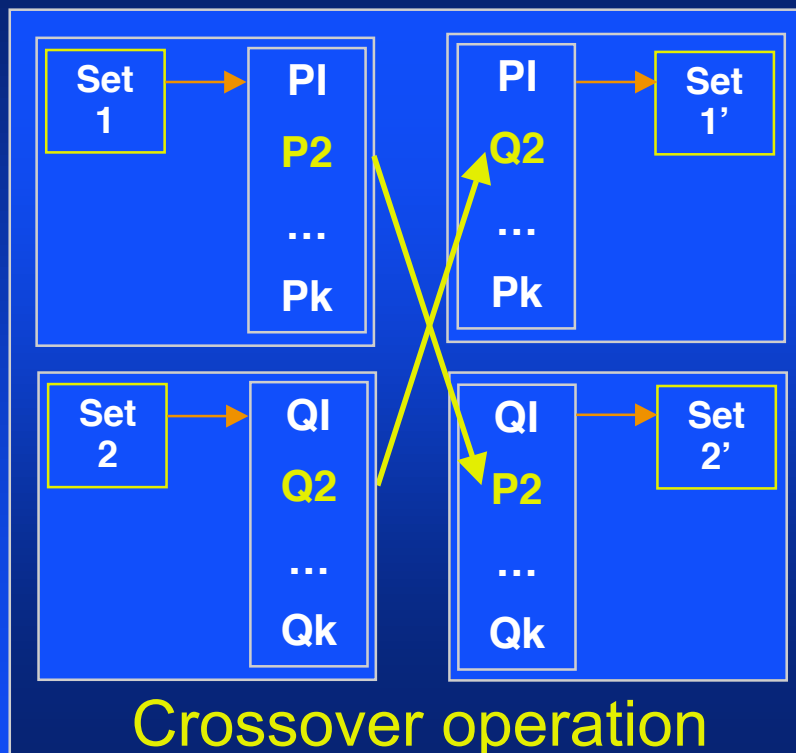


- Genetic algorithm parameter optimization is based on:
  - **Survival** of good parameter sets
  - **Evolution** of new parameter sets
  - Survival of a diverse population
- Optimization can be performed globally, rather than locally.

# Basic Evolution Operations

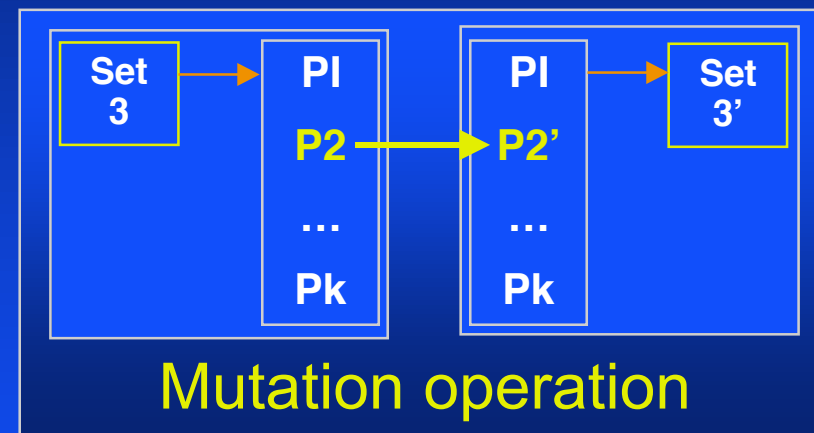
- Each set ( $S_i$ ) consists of several parameters ( $P_j$ )
- The parameters  $P_j$  can be of different kinds: real, integers, symbols, ....

## Gross Exploration



- Crossover explores **different combinations** of existing genes.

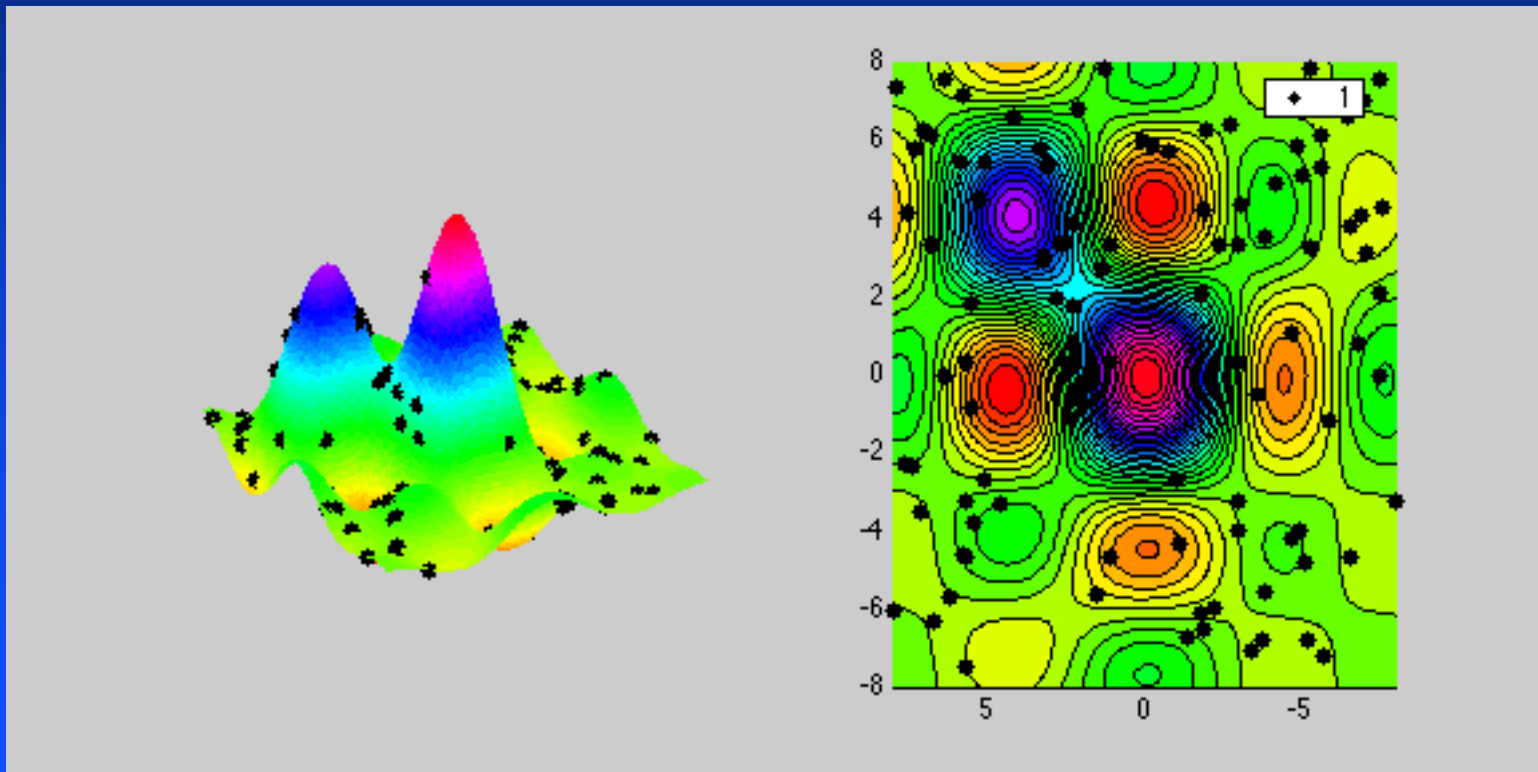
## Fine Tuning



- **Creation** of new gene values.

# Global Optimization via Genetic Algorithms

$$F(x,y) = \frac{\sin(x)}{x} \frac{\sin(y)}{y} + 0.7 \frac{\sin(x-4)}{(x-4)} \frac{\sin(y-4)}{(y-4)}$$

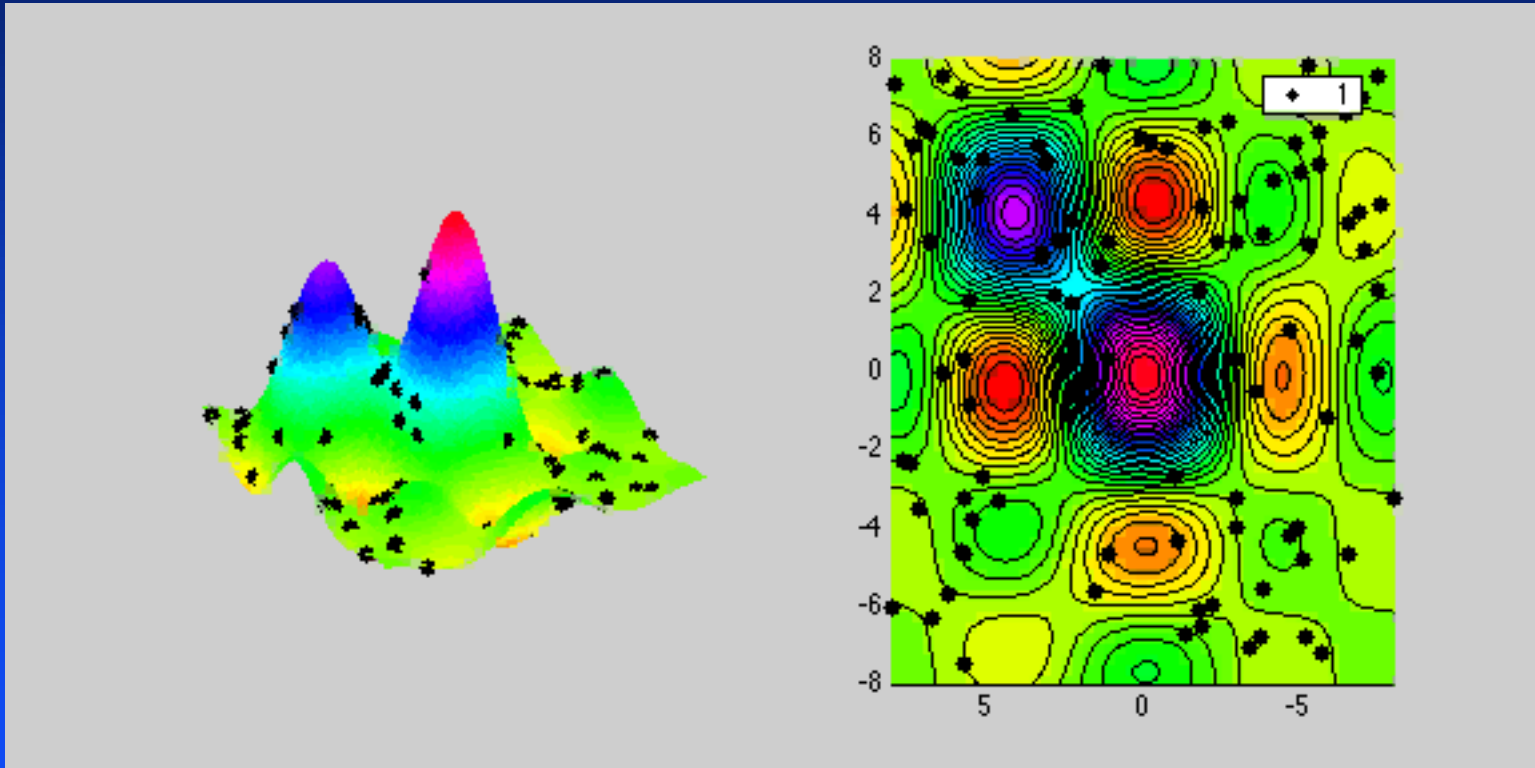




# Global Optimization: Genetic Algorithm Development

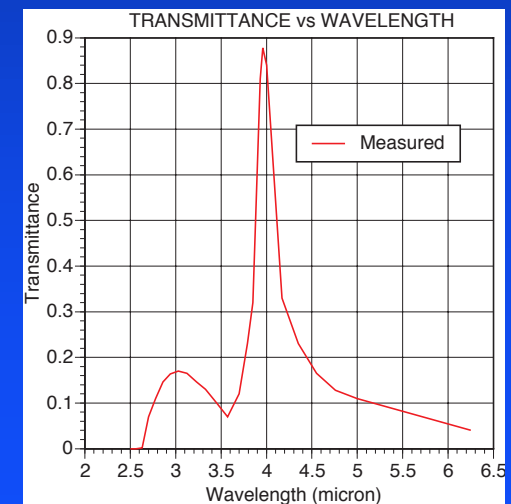
## Genetic Algorithm Convergence

pop = 100, 300 generations, steady-state (10%), 2-point crossover  $p = 0.85$ , mutation  $p = 1/2$



## Optical Filters with Patterned Arrays (Frequency Selective Surfaces-FSSs)

- E-beam lithography enables:
  - Sub-micron resolution in fabrication, allowing **infrared filtering**
- Design requires:
  - Tailoring of **passbands** for specific application
  - Understanding of element size and shape, periodicity, and materials.



# Optical Filter Design

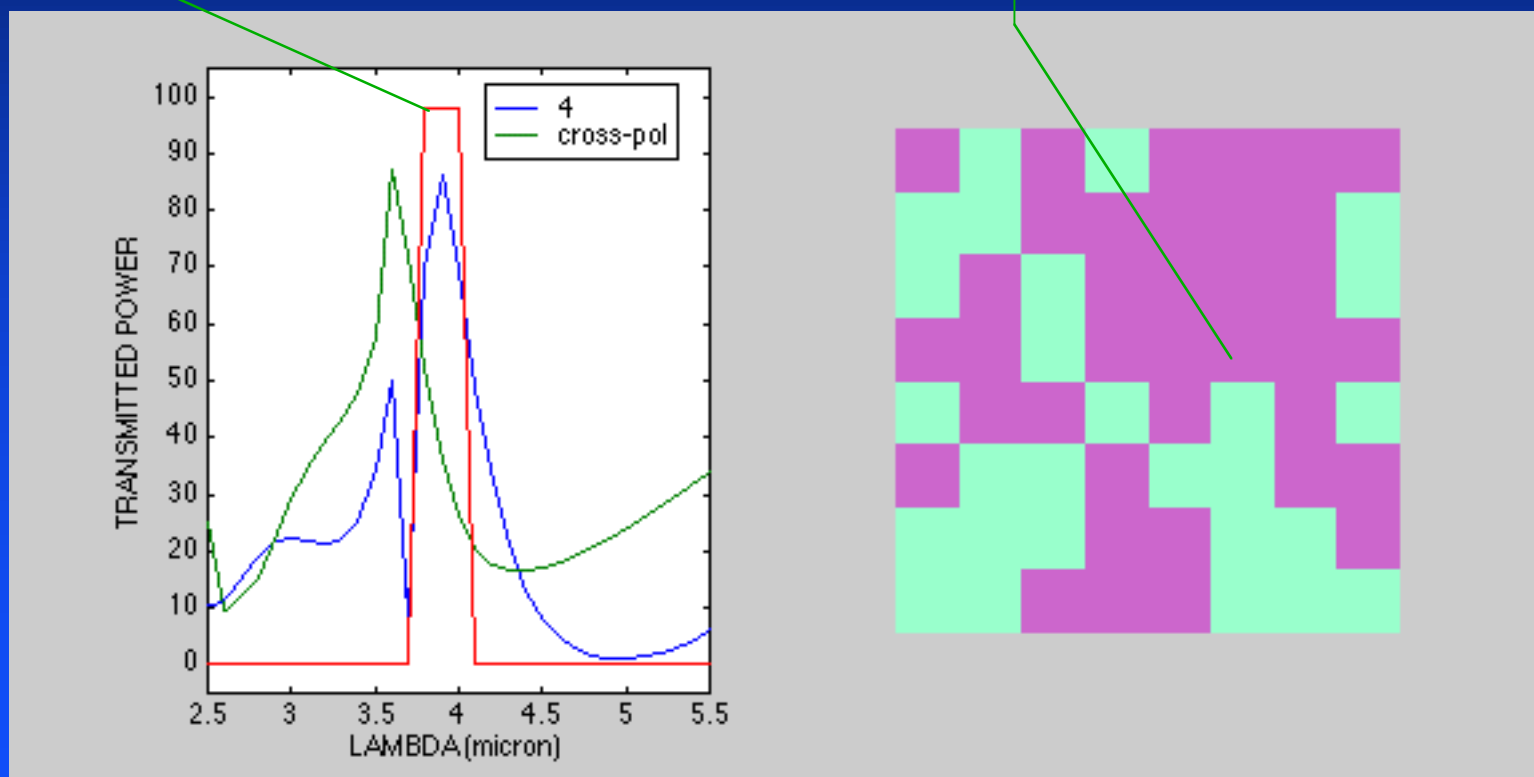
Maximize linear polarization response to **prescribed response**

Minimize opposite and cross polarizations

16x16 pixels

Mettalization

No Metal

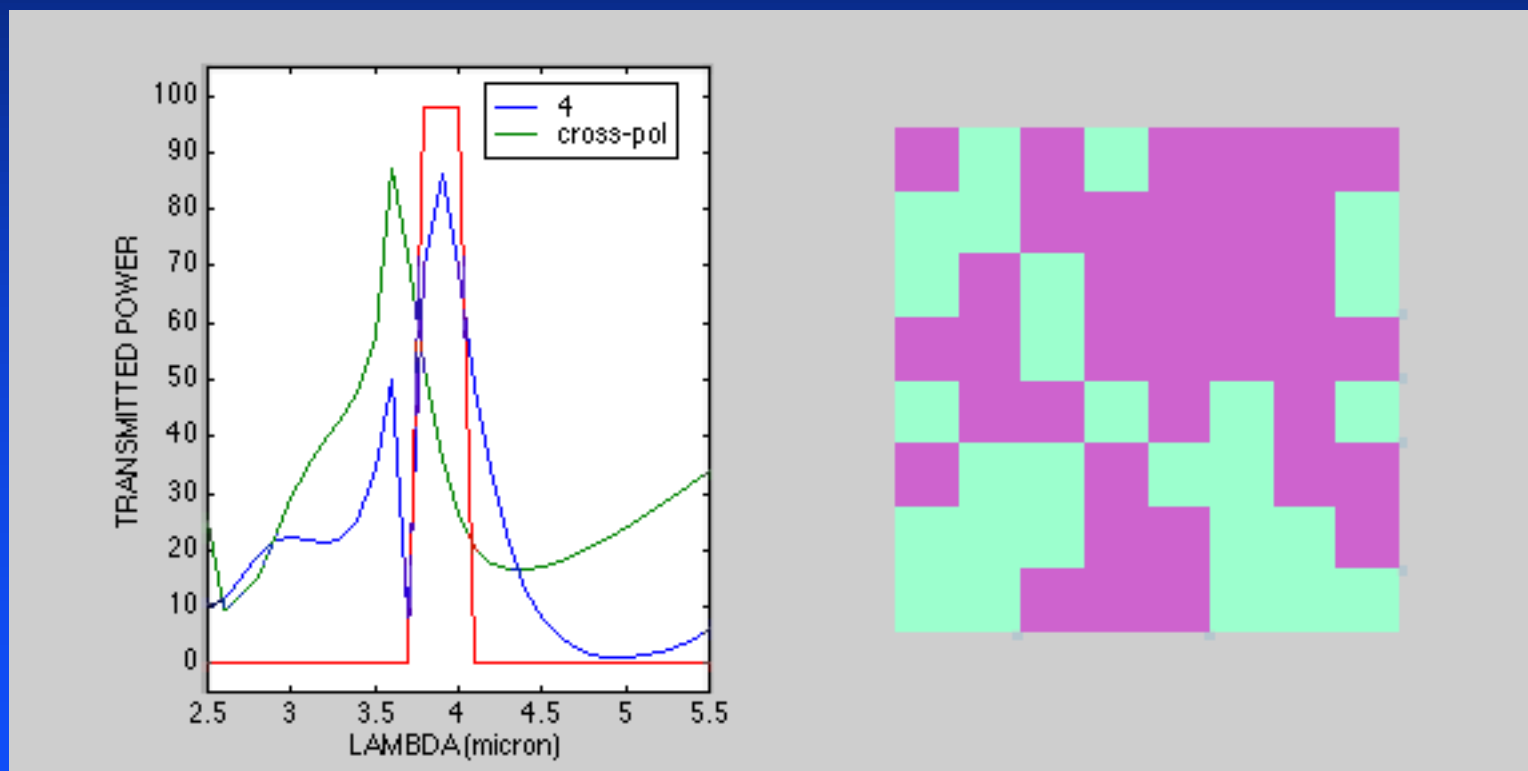


# Genetic Algorithm Design Evolution

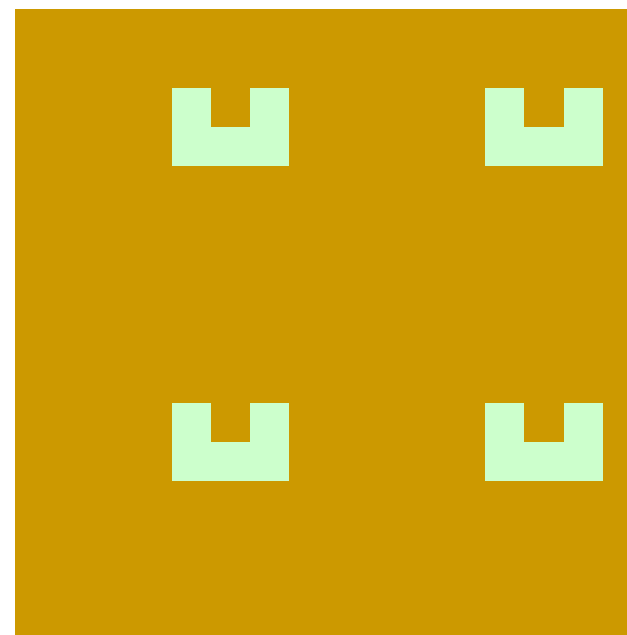
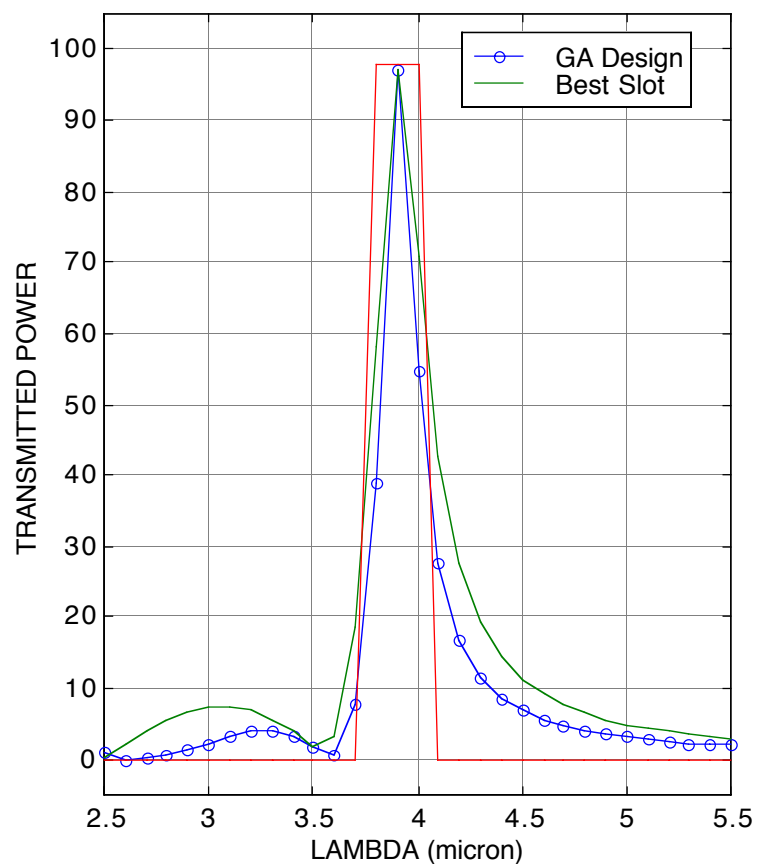
## Optimization of Slot Array

pop = 630, 300 generations, steady-state (10%), 2-point crossover  $p = 0.85$ , mutation  $p = 1/64$   
 $\Rightarrow 19,467 \sim 2 \times 10^5$

Exhaustive Search:  $2^{64} \sim 1.8 \times 10^{19}$

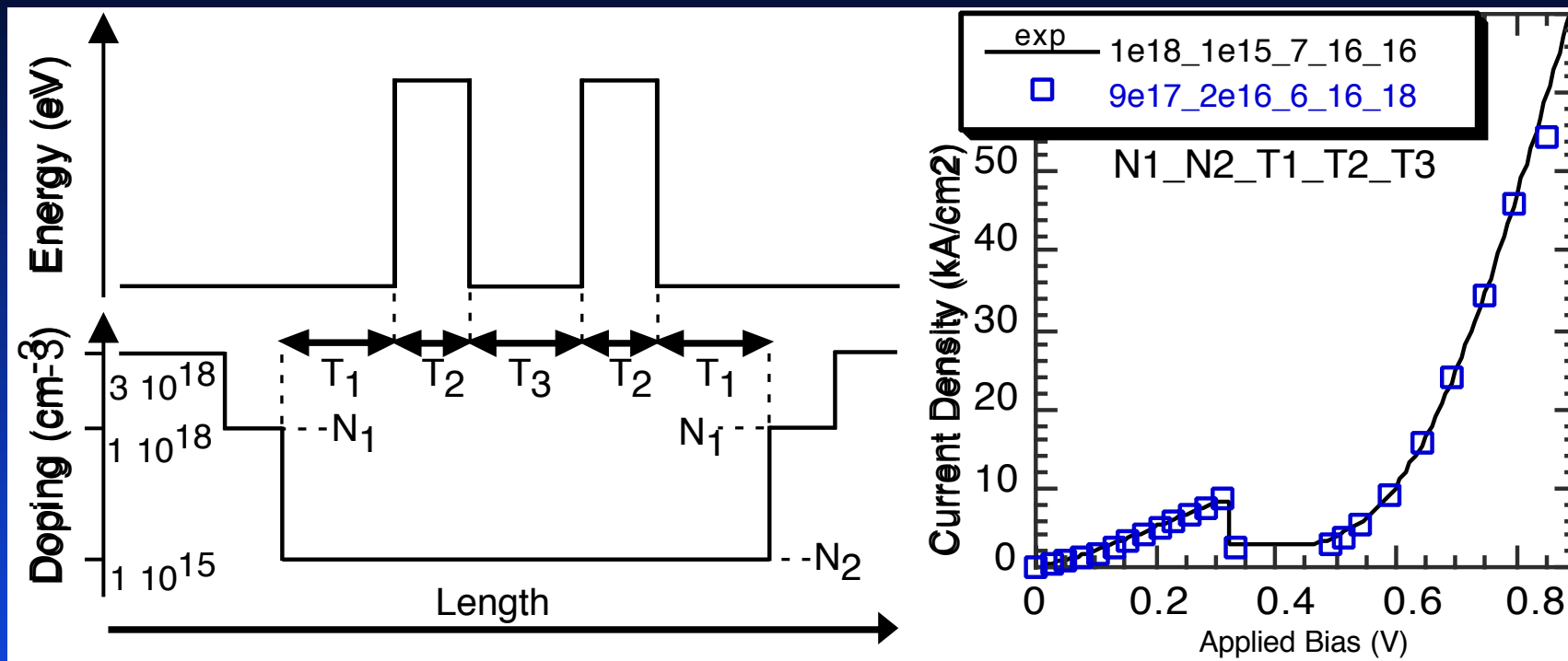


# Genetic Algorithm Design and Best Slot Array



2x2 Portion of Array Design

# GENES - RTD Structural Analysis



## Future Efforts

### • 1D:

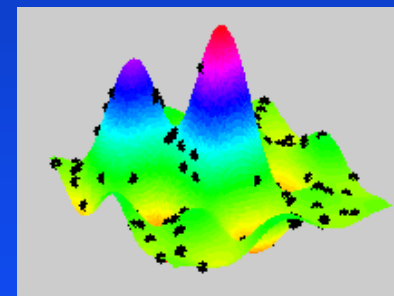
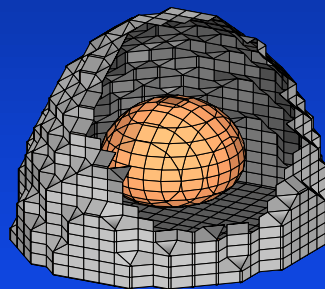
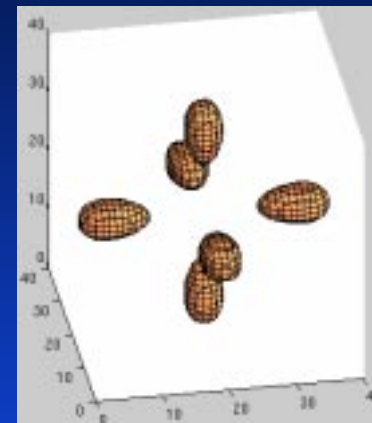
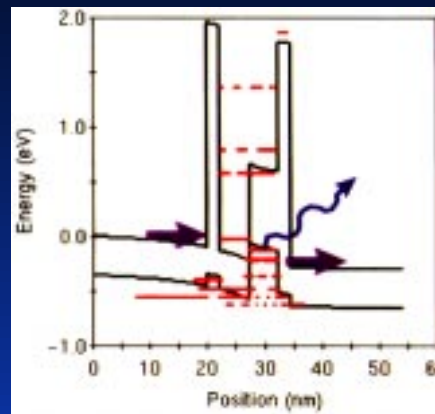
- AC and optical interactions
- Strain
- Bandstructure (sp<sup>3</sup>d<sup>5</sup>)
- Sb-based materials

### • 3D:

- Strain
- Bandstructure
- Scattering
- Coupled dot arrays
- Open Dot Systems

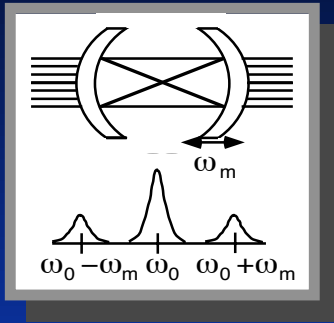
### • Analysis & Synthesis

- Generalize optimization interface:
  - User input
  - Data output
  - Other algorithms



**THz device technology**  
**Detectors**  
**Lasers**

# AC Simulation - Electron-Photon Interactions Coupled Resonators

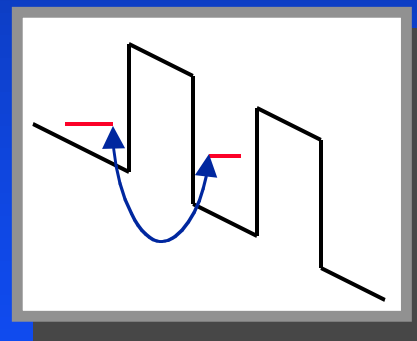
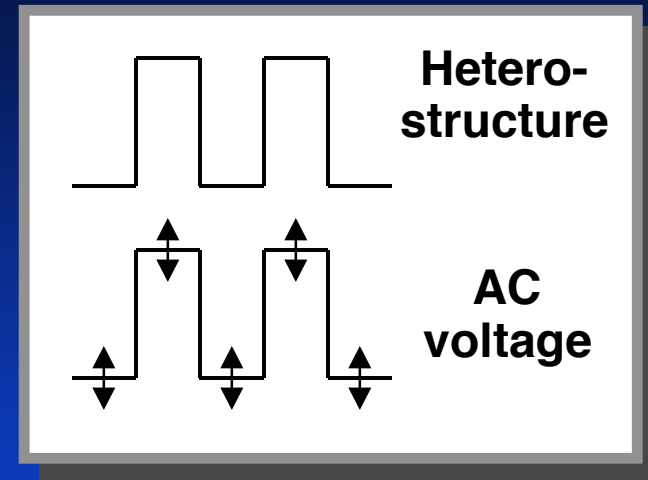


$$V_{ep} = \frac{1}{\sqrt{V}} \sum_{\vec{q}} U_{\vec{q}} e^{i\vec{q} \cdot \vec{r}} \left( a_{\vec{q}} + a_{-\vec{q}}^+ \right)$$

Electron-Phonon & Electron-Photon interaction potentials are isomorphic

**Future** NEMO capabilities:

- small signal AC response, one sideband, treatment via perturbation
- large signal response, multiple sidebands, non-perturbative treatment



**Caveat:**  
Realistic RTD's are  
Always coupled  
quantum wells

Interesting problem:  
Charge oscillations between the wells



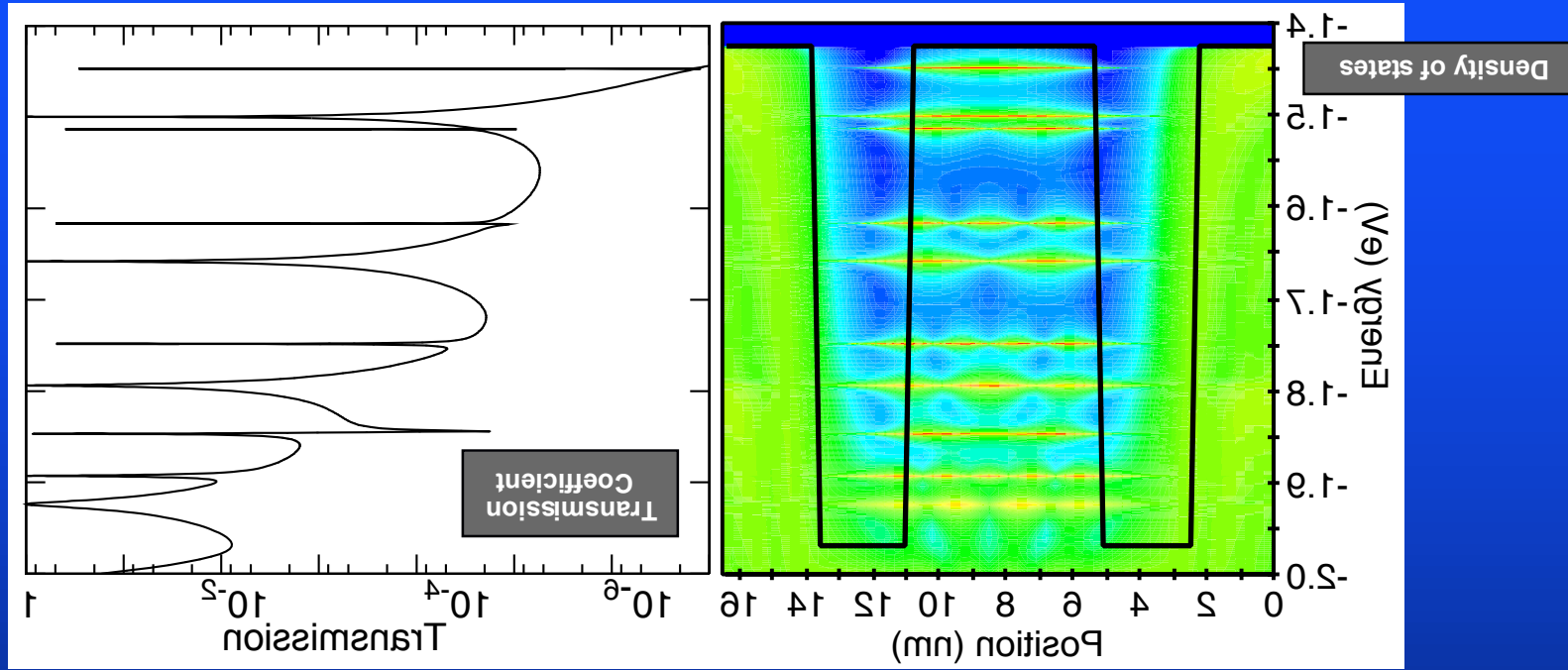
# Steps towards Laser Modeling: Heterostructure Hole Transport

## Approach:

- Use real space tight binding bandstructure representation to resolve finite size of heterostructures. (nearest and second nearest neighbor  $sp^3s^*$ )
- Examine dependence on transverse momentum and resonance broadening.

## Objective:

- Long Term: Develop ability to model electron and hole interactions in a semiconductor laser including transport.
- Short Term: Analyze transport in a hole resonant tunneling diode.



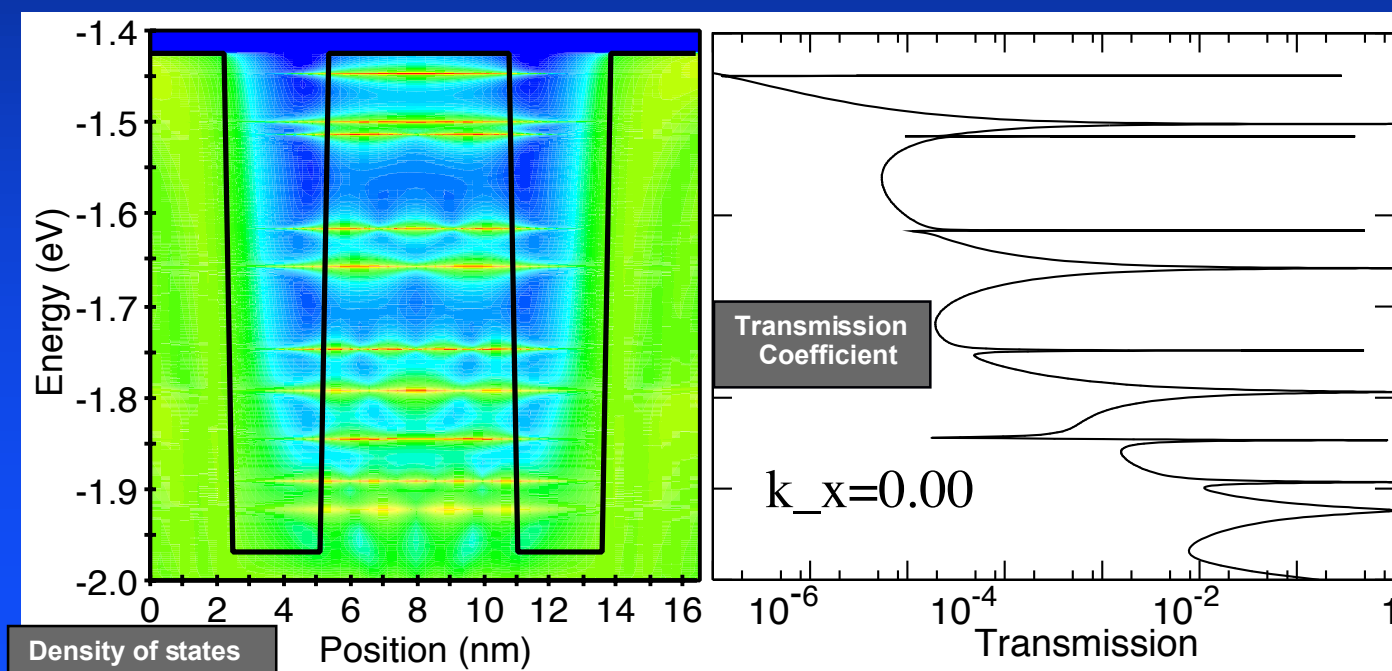
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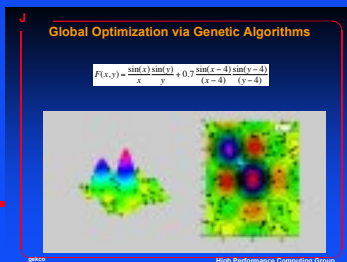
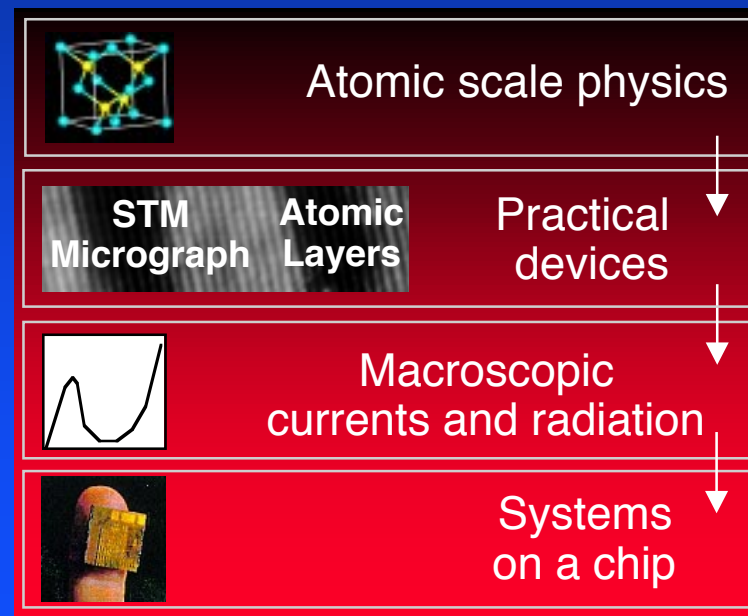
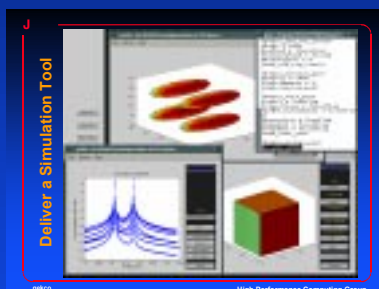
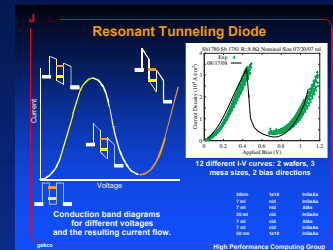
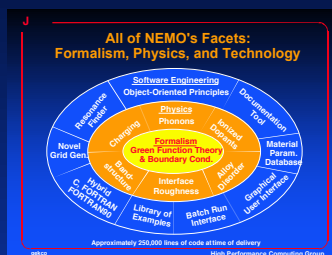
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## Future Efforts

## Conclusions





**JPL**

## Any Questions?



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High Performance Computing Group